

For Scientific Computing

Introduction

Who is this for?

This a two day workshop introducing Python as a scientific computing language.

It is intended for those who are completely new to programming in Python.

As well as an informal lecture style delivery we will also be doing exercises.

This is based on popular Python based university courses at Cambridge and UCL.

In praise of Python

- Python is a dynamic, interpreted (bytecodecompiled) language. There are no type declarations of variables, parameters, functions, or methods in source code. This makes the code short and flexible, and you lose the compile-time type checking of the source code. Python tracks the types of all values at runtime and flags code that does not make sense as it runs.
- An excellent way to see how Python code works is to run the Python interpreter and type code right into it.

Scientific Computing

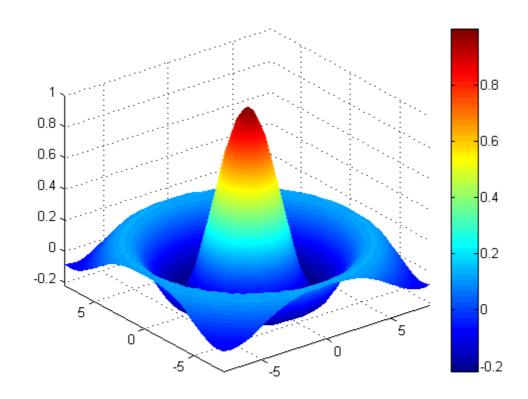
- Science has traditionally consisted of two major disciplines, theory and experimentation.
- In the last several decades a third important and exciting component has emerged, i.e. *scientific computing*.
- Scientific computing acts as an intersection of the former two areas of science. It is often closely related to theory, but it also has many characteristics in common with experimental work.
- It is therefore often viewed as a third branch of science.

The Need for Scientific Computing

- In most areas of science, computation is an invaluable complement to both experiments and theory.
- Vast majority of both experimental and theoretical research involve some numerical calculations, simulations or computer modelling.
- In many studies, pure theory alone is insufficient in validating or demonstrating results. On the other hand, experimentation as a sole means of conducting an investigation may lack the scientific rigour necessary to hold up to scrutiny.
- Experimental work may not be possible or may prove too costly.

Mathematical Modelling

Most problems based on real life are often too complex and cannot be solved using analytical techniques alone – without computational methods and scientific computing techniques we would be greatly limited to the types of modelling possible.



Why Python?

Python is a general-purpose programming language initially developed by Guido van Rossum in the 1990s.

The name has nothing to do with the reptile!

Features:

- > (very) Simple to pick up language easy to maintain
- > open-source and free language
- multi-platform available on Windows, Mac OS, Linux and almost all operating systems (Android also)
- > used by Google, YouTube, Instagram, NASA, CERN, Disney, . . .

The popularity of Python



Who uses Python?

Web applications and internet



On-line games



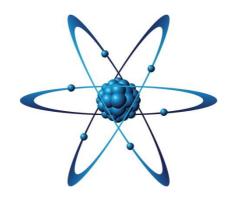
Finance



Embedded systems



Science



Instrument control



Where does Python programing fit into your life?

- Super small so shows up on embedded devices
- Several libraries for building great web apps
- Has a strong position in scientific computing. Heavily used in science (CERN and NASA) with dedicated libraries to specific areas
 - NumPy and SciPy general purposes
 - EarthPy earth sciences
 - AstroPy Astronomy
 - Pygame writing video games; supports art, music, sound, video projects, mouse and keyboard interaction
- Python popular at Disney and Lucas Film
- Large community of users, easy to find help and documentation

Interpreted versus Compiled 1

Programs are indirectly executed by an interpreter program which reads the source code and translates it while in motion, into a series of computations and system calls. The source has to be re-interpreted (and the interpreter present) each time the code is executed.

- Slower than compiled, with limited access to the underlying operating system and hardware
- Easier to program
- Less strict on coding errors

Interpreted versus **Compiled** 2

Most conventional kind of language is compiled. Programs are converted into machine code by a compiler and then directly executed. This executable file can be run without the need to refer back to the source code.

- Give excellent performance with limited access to the underlying operating system and hardware
- Can be difficult to program in
- Most of the software we use is delivered as compiled binaries, from software which the use doesn't see

Installation of Canopy Express

From the link

https://store.enthought.com/downloads

and download the version adapted to your system of Canopy Express.

How to know if your PC/laptop is a 32 or 64-bit system

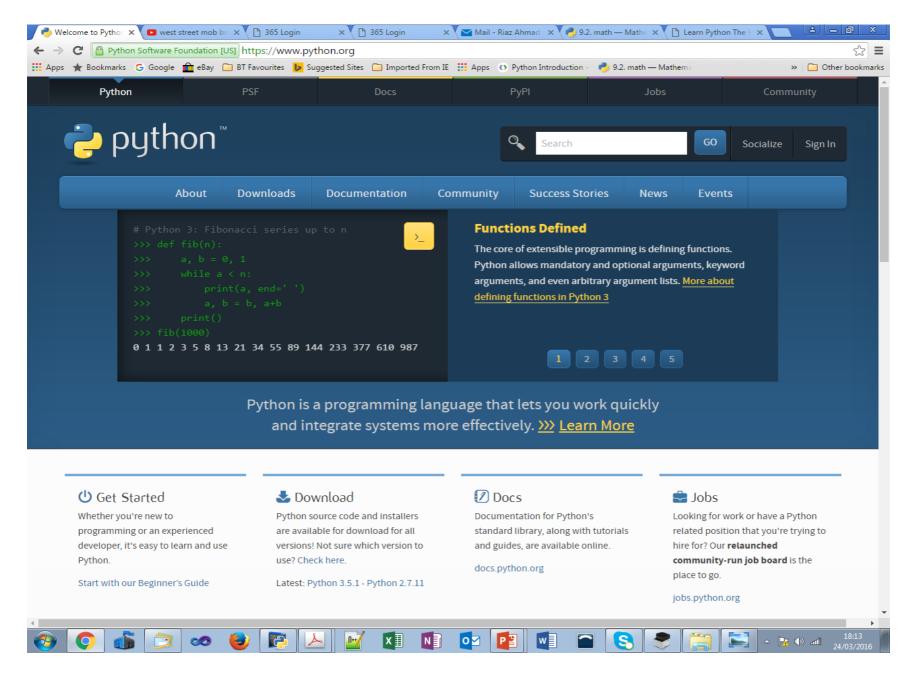
Linux uname -a and if you see x64 then 64-bit else 32-bit

Mac uname -a also

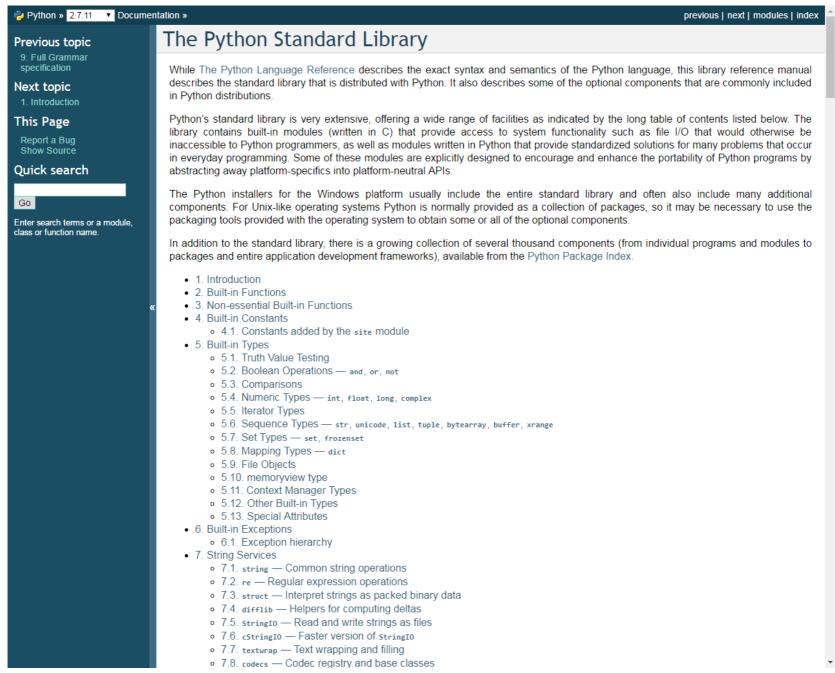
Windows Click Start, right-click My Computer, and then click

Properties if you see 64-bit it's a 64-bit system

https://www.python.org/

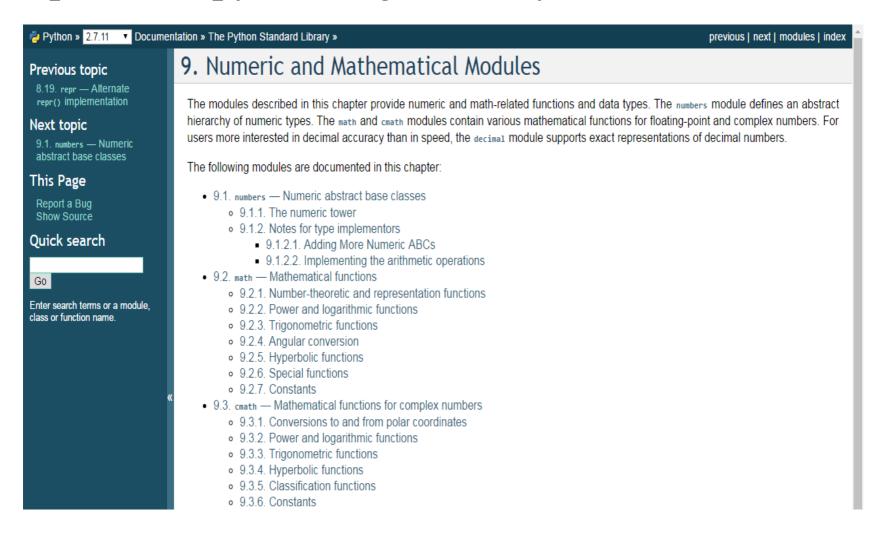


https://docs.python.org/2/library/



Welcome to your new best friend!

https://docs.python.org/2/library/numeric.html



What sort of language is Python?

Compiled			Interpreted
Explicitly compiled to machine code	Explicitly compiled to byte code	Implicitly compiled to byte code	Purely interpreted
C, C++, Fortran	Java, C#	Python	Shell, Perl

Distributions of Python

Python is a language, then there exist different **distributions** of Python (Python official, Anaconda Python, Enthought Canopy, pythonxy . . .).

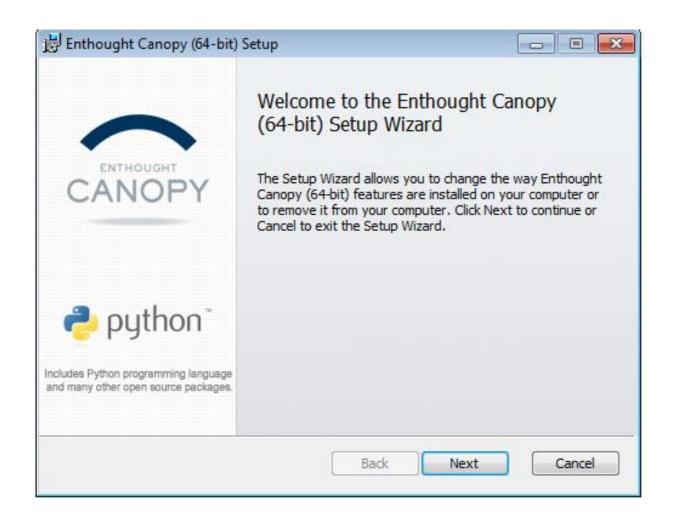
Each distribution provides specific tools (Editors, **packages** pre-installed, support for a given platform . . .).

On Linux and Mac OS, Pythons comes pre-installed with the operating system. However, many useful packages (e.g. SciPy) must be installed by hand. For its easy interface we will use **Enthought Canopy**.

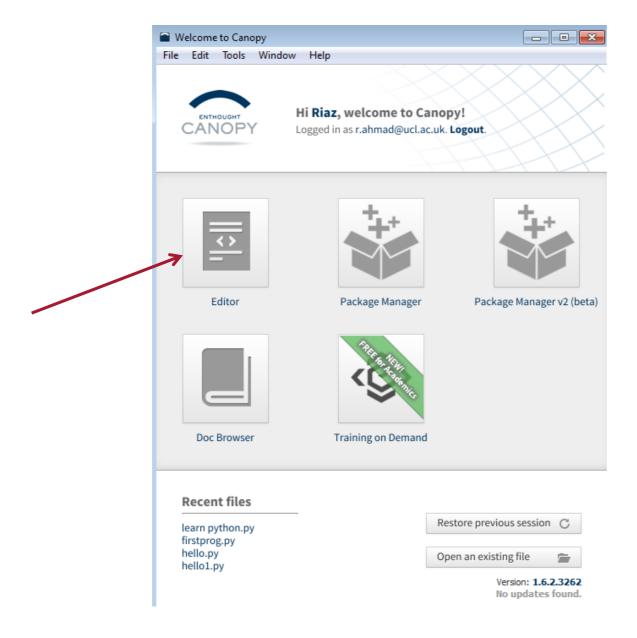
Python 2 or 3

- Two Python versions are in current use: Python 2 and Python 3.
- > Python 3 is not backward compatible with Python 2.
- The largest community is still using Python 2 since there is still several packages incompatible with Python 3.
- That's why we will use Python 2 (more precisely Python 2.7.6).

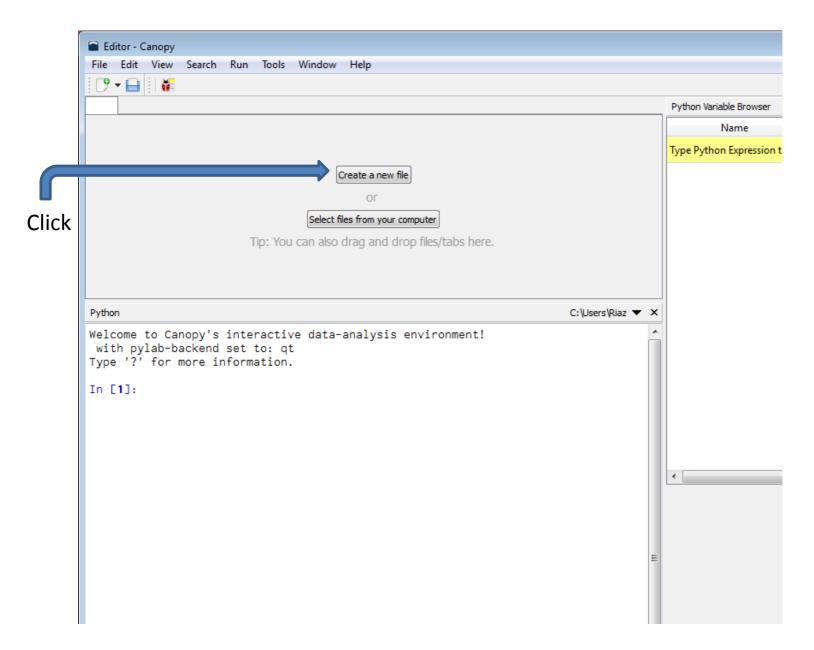
Installation on Windows



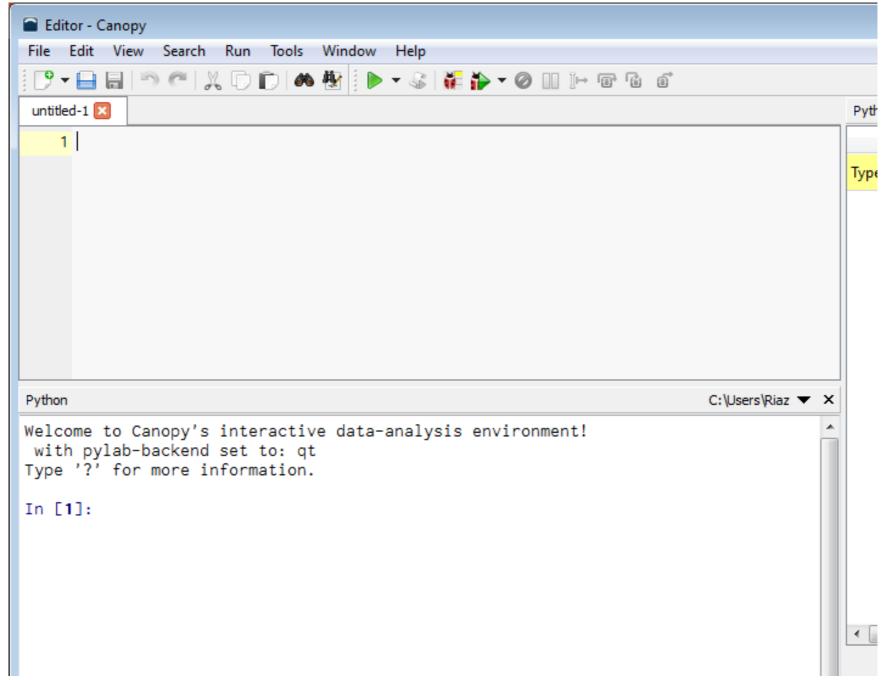
Getting started with Canopy



Editing Environment



Ready to start programming!



Syntactic sugar

syntactic sugar is syntax within a programming language that is designed to make things easier to read or to express. It makes the language "sweeter" for human use: things can be expressed more clearly, more concisely, or in an alternative style that some may prefer.

https://en.wikipedia.org/wiki/Syntactic_sugar

Python script

Python script is a set of instructions, written in the Python language, that run in order and carry out a series of commands.

Importing Modules

When a Python program starts it only has access to a basic functions and classes.

```
("int", "dict", "len", "sum", "range", ...)
```

"Modules" contain additional functionality.

Use "import" to tell Python to load a module.

>>> import math

>>> import nltk

Type Powershell in the start menu

```
Windows PowerShell
Windows PowerShell
Copyright (C) 2009 Microsoft Corporation. All rights reserved.
PS C:\Users\Riaz> python
Python 2.7.10 |CUSTOM| (default, Oct 21 2015, 17:08:47) [MSC v.1500 64 bit (AMD64)] on win32
Type "help", "copyright", "credits" or "license" for more information.
```

Command Line

```
C:\Python27\python.exe
Python 2.7.10 (default, May 23 2015, 09:44:00) [MSC v.1500 64 bit (AMD64)] on wi
Type "help", "copyright", "credits" or "license" for more information.
```

Running Python

```
Windows prompt
                                      Window command
                                      Introductory blurb
> python
Python 2.7.10 (default, Oct 21 2015, 17:08:47)
[MSC v.1500 64 bit (AMD64)] on win 32
                                      Python version
>>>
                                      Python prompt
```

Quitting Python

>>> **exit()**

>>> quit()

Any one of these

Welcome to Python – first program

```
Python prompt
                                                    Python command
>>> print('Hello, world!')
Hello, world! ←
                                                    Output
                                                    Python prompt
 ython 2.7.10 (default, May 23 2015, 09:44:00) LMSC v.1500 64 bit (AMD64)] on w:
Type "help", "copyright", "credits" or "license" for more information.
>>> print('Hello, world!')
Hello. world!
```

```
>>> print 'Hello, world!'
Hello, world!
>>>
```

We note that the same outcome is obtained without the use of parentheses.

Brackets are used for consistency with version 3

A string is a sequence of characters enclosed in single or double quotes.

Python interactive shell

You can type things directly into a running Python session

```
Python 2.7.10 (default, May 23 2015, 09:44:00) [MSC v.1500 64 bit (AMD64)] on wing might be supported by the companion of the
```

Whitespace

Whitespace is meaningful in Python: especially indentation and placement of newlines.

- Use a newline to end a line of code.
- No braces { } to mark blocks of code in Python... *Use consistent indentation instead*.
 - The first line with less indentation is outside of the block.

The first line with more indentation starts a nested block

 Often a colon appears at the start of a new block. (e.g. for function and class definitions.)

Assignment

To assign a value to a variable, we use the operator = (not to be confused with 'equal to'). It is evaluated from right to left

```
name = "Riaz"
```

can be seen as name ← "Riaz"

and interpreted as 'Riaz is assigned to the variable name'.

Interactive on Canopy

```
In [1]: name="Riaz"
In [2]: print name
Riaz
In [3]:
```

```
In [4]: print 2+2*3
8
In [5]: print "hello", name
hello Riaz
```

Interactive on PowerShell

```
Windows PowerShell

Windows PowerShell

Copyright (C) 2009 Microsoft Corporation. All rights reserved.

PS C:\Users\Riaz\> python

Enthought Canopy Python 2.7.10 | 64-bit | (default, Oct 21 2015, 17:08:47)

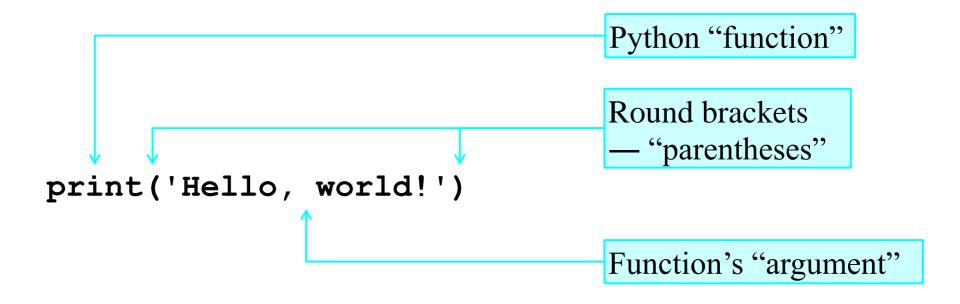
Type "help", "copyright", "credits" or "license" for more information.

>>> name="Riaz"
>>> print name

Riaz

>>> ___
```

Python commands



print ≠ PRINT

"Case sensitive"

Defining strings

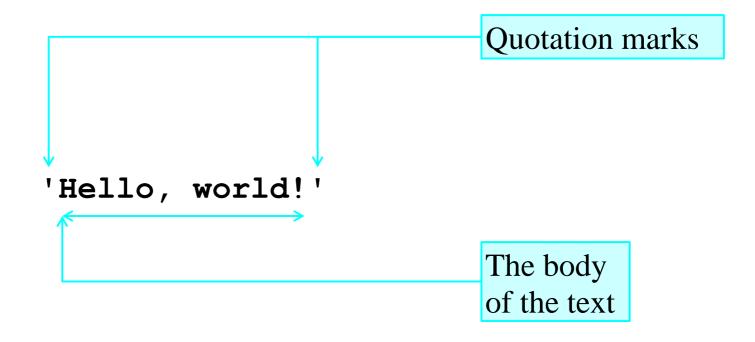
Strings can be defined using

• single quotes '....'

• double quotes " "

So strings defined using single and double quotes are identical

Python text





The quotes are not part of the text itself.

Quotes?

Manipulating Strings

- strings defined using single and double quotes are identical
- if you want to use quotes in your string, switch between single and double quotes, example:

```
print("He said, 'after you, Sir!'.")
```

- > Anything following # is a comment
- > to use \ in strings, use \\
- We can add arbitrary quotes by escaping them: print("She said. \"He\'s coming.\".")
- > \is **reserved** (\n for a newline, \t for a tabulation, \'\...)

Modules

When a Python program starts it only has access to basic functions and classes.

Most of the functionality in Python is provided by *modules*. The Python Standard Library is a collection of modules that provides cross-platform implementations of common facilities such

- I/O
- Mathematics
- String manipulation

Use "import" to tell Python to load a module e.g.

>>> import math

More on this shortly

Operations on Strings

Two strings can be joined/added together (**concatenated**) using the **+ operator**:

```
In [1]: "Hello, " + "Riaz!"
Out[1]: 'Hello, Riaz!'
```

To find out the length of a string, use **the function** len():

```
In [2]: len("supercalifragilisticexpialidocious") # from Mary Poppins
Out [2]: 34
```

We can join several copies of a string with the **operator** *

```
In [3]: 3 * "AbC"
```

Out [3]: 'AbCAbCAbC'

Slicing

Slicing is used to extract a portion of the string. Here is an example:

```
>>> string = 'Press return to exit'
>>> print string[0:12]
Press return
string[12]
```

Immutability

A string is an *immutable* object. Its individual characters cannot be modified with an assignment statement and it has a fixed length. Any attempt to be violate this property will result in TypeError

Consider the code below:

Text: a string of characters

```
>>> type('Hello, world!')
                                              A string of characters
<class 'str'> <
                                              Class: string
                                              Length: 13
                                              Letters
       13
                                      r
 str
```

Pure concatenation

```
>>> 'Hello, _ ' + 'world!'
'Hello, world!'
                                   Only simple
>>> 'Hello,' + '_world!'
                                   concatenation
'Hello, world!'
>>> 'Hello,' + 'world!'
                                   No spaces added
                                   automatically.
'Hello, world!'
```

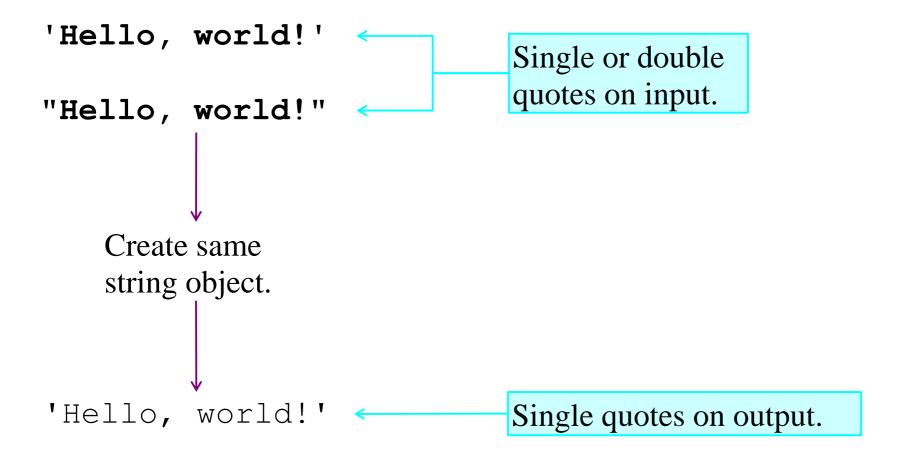
Single & double quotes

```
>>> 'Hello, world!' Single quotes

'Hello, world!" Double quotes

'Hello, world!" Single quotes
```

Python strings: input & output



Uses of single & double quotes

```
>>> print('He said "hello" to her.')
He said "hello" to her.
>>> print("He said 'hello' to her.")
He said 'hello' to her.
```

Why we need different quotes

```
>>> print('He said 'hello' to her.')
File "<stdin>", line 1
  print('He said 'hello' to her')
SyntaxError: invalid syntax
```

Adding arbitrary quotes

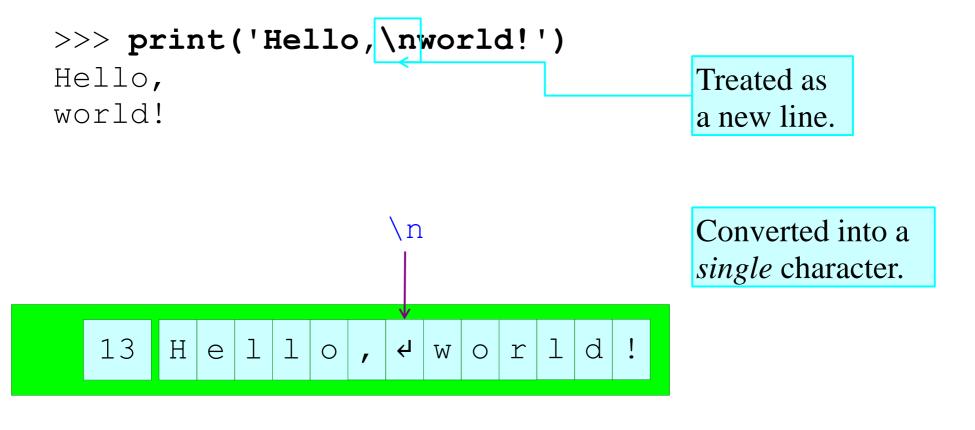
"Escaping"

character.

Putting line breaks in text

```
Hello,
                                         What we want
world!
>>> print('Hello, | 4 |
                                         Try this
world')
>>> print('Hello, |
File "<stdin>", line 1
  print('Hello,
SyntaxError: EOL while
                                         "EOL": End Of Line
scanning string literal
```

Inserting "special" characters



>>> len('Hello,\nworld!')

13

len() function: gives the length of the object

The backslash

Special ----Ordinary

Ordinary ———— Special

\n Multiline strings

"Shoot all the blue jays you want, \nif you can hit 'em, but remember it's a \nsin to kill a mockingbird. \nThat was the only time I ever heard Atticus say \nit was a sin to do something, \nand I asked Miss Maudie about it."

By default, Python assumes that the whole instruction is contained in a single line.

Special input method for long text

Shoot all the blue jays you want, if you can hit 'em, but remember it's a sin to kill a mockingbird. That was the only time I ever heard Atticus it was a sin to do something, and Lasked Miss Maudie about it. Multiple lines

Triple

Python's "secondary" prompt

```
Python asking for more
 of the same command.
In [20]: print(''' Start spreading the news, I'm
    ...: leaving today. I want to be a part of it,
    ...: New York, New York.''')
 Start spreading the news, I'm
leaving today. I want to be a part of it,
New York, New York.
```

It's still just text!

```
>>> 'Hello,\nworld!'
'Hello\nworld'
                                     Python uses \n to represent
                                     line breaks in strings.
>>> '''Hello,
... world!'''
'Hello\nworld' <-
                                     Exactly the same!
```

Your choice of input quotes:

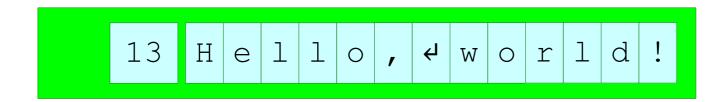
Four inputs:

```
'Hello, \nworld!'

''Hello, \nworld!"

'''Hello,
world!'''
world!''''
```

Same result:



Attaching names to values

```
"variables"
>>> message='Hello, world!'
>>> message
'Hello, world!'
>>> type (message)
<class 'str'>
```

Some more types

```
>>> type (G'day!')
                                  string of characters
<class 'str'>←
>>> type (-62)
<class 'int'>←
                                 integer
>>> type(pi)
<class 'float'>←
                                 floating point number
```

Converting text to integers

```
>>> int('10')
10
>>> int('_-100_')
-100
                                                -100
>>> int('100-10')
```

ValueError:

invalid literal for int() with base 10: '100-10'

Exercise 1.0

1. Write script to print the following text (with the line breaks) and then run the script.

coffee café caffè Kaffee 2. Create the following output

It is a tale
Told by an idiot, full of sound and fury,
Signifying nothing.

3. Create a file called car.py and write a comment next to each line explaining what it does in English

```
1 cars = 100
2 space_in_a_car = 4.0
3 drivers = 30
4 passengers = 90
5 cars_not_driven = cars - drivers
6 cars_driven = drivers
7 carpool_capacity = cars_driven * space_in_a_car
8 average_passengers_per_car = passengers / cars_driven
9
10
11 print "There are", cars, "cars available."
12 print "There are only", drivers, "drivers available."
13 print "There will be", cars_not_driven, "empty cars today."
14 print "We can transport", carpool_capacity, "people today."
15 print "We have", passengers, "to carpool today."
16 print "We need to put about", average_passengers_per_car, "in each car."
```

Exercise 1.1

4. Rewrite the code below with your personal details and run. You should experiment with the two string formatting characters %s and %d

```
1 my_name = 'Riaz Ahmad'
 2 my_age = 49 # I use oil of ulay!
 3 my_height = 70 # inches
 4 my_weight = 85 # kgs
 5 my_eyes = 'Brown'
 6 my_teeth = 'White'
 7 my_hair = 'Black'
 9 print "Let's talk about %s." % my_name
10 print "He's %d inches tall." % my_height
11 print "He's %d pounds heavy." % my_weight
12 print "Actually that's not too heavy."
13 print "He's got %s eyes and %s hair." % (my_eyes, my_hair)
14 print "His teeth are usually %s depending on the toothpaste." % my_teeth
15
16 # this line is tricky, try to get it exactly right
17 print "If I add %d, %d, and %d I get %d." % (
      my_age, my_height, my_weight, my_age + my_height + my_weight)
18
```

Exercise 1.2

5. This exercise is for experimenting with data input from the keyboard. You will also notice a new character %r.

```
1 print "How old are you?",
2 age = raw_input()
3 print "How tall are you?",
4 height = raw_input()
5 print "How much do you weigh?",
6 weight = raw_input()
8 print "So, you're %r years old, %r inches tall and %r kgs heavy." % (
     age, height, weight)
```

Control statements - Else and If

An if-statement creates what is called a "branch" in the code.

The if-statement tells the Python script, "if this boolean expression is True, then run the code under it, otherwise skip it."

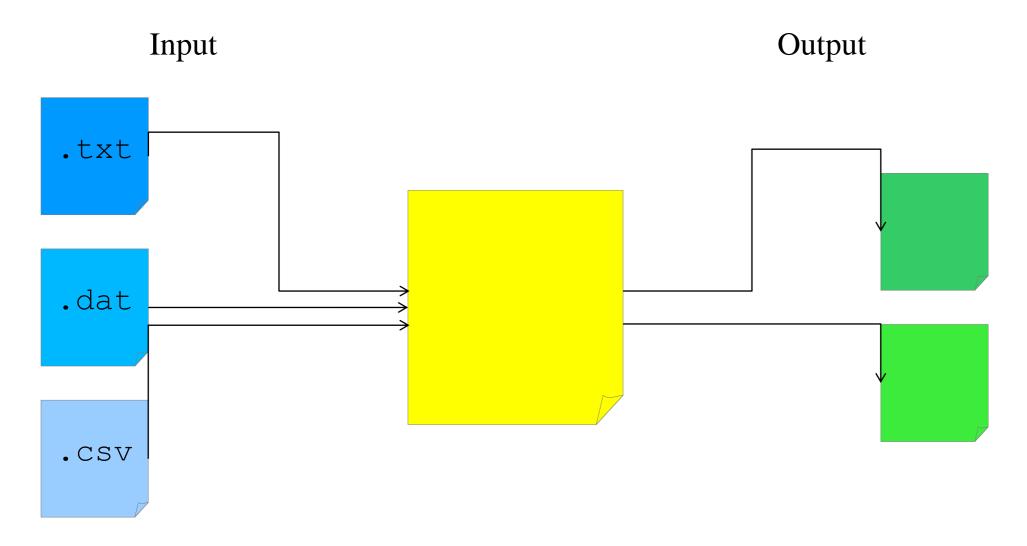
The code under the if needs to be indented four spaces? A colon at the end of a line is how you tell Python you are going to create a new "block" of code, and then indenting four spaces tells Python what lines of code are in that block. This is *exactly* the same thing you will do with functions later. Not indenting will give an error.

Exercise 2.0

Look at the code below. Make sure you are happy with the logic. Add more Boolean expressions and increase the complexity. Use some of the earlier script to increase complexity.

```
1 people = 30
2 \text{ cars} = 40
3 trucks = 15
6 if cars > people:
       print "We should take the cars."
8 elif cars < people:
       print "We should not take the cars."
10 else:
      print "We can't decide."
11
12
13 if trucks > cars:
      print "That's too many trucks."
15 elif trucks < cars:
       print "Maybe we could take the trucks."
17 else:
      print "We still can't decide."
18
19
20 if people > trucks:
      print "Alright, let's just take the trucks."
22 else:
      print "Fine, let's stay home then."
23
```

Files



Reading Writing

Reading text files

This is the simplest script that opens a file for reading, loads its contents into a text variable and closes the file. In my example the file called Humpty.txt has location C:\Users\Riaz\Desktop\Humpty.txt

```
In [13]: f=open("C:\Users\Riaz\Desktop\Humpty.txt")
In [14]: rhyme=f.read()
In [15]: f.close()
In [16]: print rhyme|
Humpty Dumpty sat on a wall,
Humpty Dumpty had a great fall.
All the king's horses and all the king's men
Couldn't put Humpty together again.
In [17]:
```

Single quotes also work

The with statement

Closing a file is easily overlooked. For this and other reasons it is better to use the with statement:

```
with open("C:\Users\Riaz\Desktop\Humpty.txt") as f:
    rhyme=f.read() # remember to intend
print rhyme

Python

In [19]: %run "c:\users\riaz\appdata\local\temp\tmpedti3w.py"
Humpty Dumpty sat on a wall,
Humpty Dumpty had a great fall.
All the king's horses and all the king's men
Couldn't put Humpty together again.
```

Writing to files

- > Opening files for writing:
 - 1. First decide what to do if there is already a files with the same name.
 - 2. If you want to delete the file and start from scratch, pass "w" as the second argument to open (). Example: open ("myfile.txt", "w")
 - If you want to append text to that file, pass "a" as the second argument to open(). Example: open("myfile.txt", "a")

Writing data:

print has a special syntax causing its output to be redirected to a file:

```
print >> file_object, comma_separated_expressions
```

Example:

```
1 from math import *
2 with open("results.txt", "w") as f:
3    print >> f, "Total:", 1025.5 , pi**2 , exp(1)
```

Numbers in Python

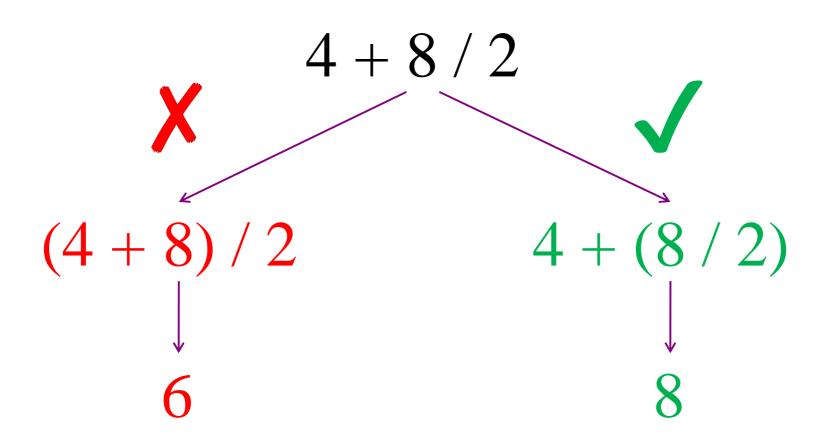
A number can be represented by different types of variables:

- > int for integer
- > long integers for integer not in the previous interval. They are stored in a more complex format. Such integers are printed out with an L at the end:

```
In [1]: 2**100
Out[1]: 1267650600228229401496703205376L
```

The range of these long integers is only limited by the amount of available memory in the computer. Operations on long integers are slower than on normal integers.

Simple Arithmetic Calculations – BIDMAS or BODMAS



Manipulating in-built functions

```
Python
                                                                                       C:\Users\Riaz ▼
Welcome to Canopy's interactive data-analysis environment!
 with pylab-backend set to: qt
Type '?' for more information.
In [1]: print pi
3.14159265359
In [2]: print e #exp(0)
2.71828182846
In [3]: x=2
In [4]: print x**4 # 2 to the power 4
16
In [5]: math.pi
Out[5]: 3.141592653589793
In [6]: from math import * # from the maths library import all functions and variables
In [7]:
```

Converting text to floats

```
>>> float('10.0')

10.0

>>> float('_10._')
```

10.0

'10.0' is a string

10.0 is a floating point number

Spaces are ignored

Converting between ints and floats

```
>>> float(10)
10.0
>>> int(10.9)
10
```

Truncates fractional part

```
>>> int(-10.9)
```

-10

Converting into text

Converting between types

```
int() anything \longrightarrow integer float() anything \longrightarrow float str() anything \longrightarrow string
```

Functions named after the type they convert *into*.

Exercise 4.0

Write python programs to do the following:

- 1. Prompt the user with the text "How much? ...".
- 2. Convert the user's answer to a floating point number.
- 3. Print 2.5 plus that number.

Integer arithmetic

Spaces around the operator don't matter.

Type-casting

```
>>> 20.0/3
```

6.66666666666667

```
>>> float(20)/3
```

6.66666666666667

>>> 20/float(3)

6.66666666666667

>>> **float(20/3)**

6.0

Integer powers **

We wish to calculate 4^3

64

SyntaxError: invalid syntax

Spaces *around* the operator don't matter.

Spaces *in* the operator do!

Integer remainders

Use "%" to obtain integer remainders

In the example above "%" is modulo and can be used to determine if an integer is even or odd. $x \in \mathbb{Z}$ and x%2 = 0 then x is even, else x is odd.

Remainder is always non-negative

How big can a Python integer be?

```
>>> 2**2
>>> 4**2
16
>>> 16**2
256
>>> 256**2
65536
>>> 65536**2
4294967296
```

How big can a Python integer be?

>>> 4294967296**2

>>> 18446744073709551616**2

>>> 340282366920938463463374607431768211456**2

>>> 115792089237316195423570985008687907853269 984665640564039457584007913129639936**2

How big can a Python integer be?

There is no limit! 9061394905987693002122963395687782878948440616007412945674 Except for 7164237715481632138063104590291613692670834285644073044789 machine 4657634732238502672530598997959960907994692017746248177184

Floating point numbers

1.() 0.33333333 3.14159265 2.71828182

Basic operations

25.0

100.0

3200000.0

15.0

4.0

Equivalent to integer arithmetic

Floating point imprecision

```
>>> 1.0 / 3.0
```

0.3333333333333333

```
>>> 10.0 / 3.0
```

3.33333333333335

If you are relying on this last decimal place, you are doing it wrong!

 \approx 17 significant figures

Hidden imprecision



0.1

0.2

0.3000000000000004

Really: if you are relying on this last decimal place, you are doing it wrong!

How big can a Python float be? — 1

>>> 65536.0**2

4294967296.0

So far, so good.

>>> 4294967296.0**2

1.8446744073709552e+19

Switch to "scientific notation"

1.8446744073709552 e+19

 $1.8446744073709552 \times 10^{19}$

Floats are not exact

>>> 4294967296.0**2

1.8446744073709552e+19

Floating point

>>> 4294967296**2

18446744073709551616

Integer

 $1.8446744073709552 \times 10^{19}$

→ 18446744073709552000

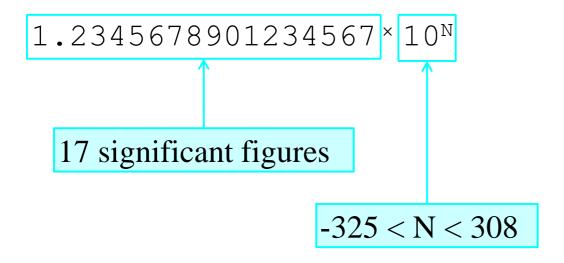
- 18446744073709551616

384

How big can a Python float be? — 2

```
>>> 1.8446744073709552e+19**2
3.402823669209385e+38
>>> 3.402823669209385e+38**2
1.157920892373162e+77
>>> 1.157920892373162e+77**2
                                        So far, so good.
1.3407807929942597e+154
                                        Too big!
>>> 1.3407807929942597e+154**2
OverflowError: (34,
'Numerical result out of range')
```

Floating point limits



Positive values:

 $4.94065645841 \times 10^{-324} < N < 8.98846567431 \times 10^{307}$

Scientific notation

Scientific notation is a convenient way of expressing very large or very small numbers.

General form:

 $aen = a \times 10^n$, where a is a float and n is an integer.

Examples:

$$3e8 = 3 \times 10^{8}$$

 $9.109e - 19 = 9.109 \times 10^{-19}$

Exercise: In the Interactive Python Terminal, try these instructions and write what each instruction does. First example already done

```
1 \times = 1 \# we define x=1
 2 v = x + 3
 37=4+10 \pm \pm -5
 4 \text{ zbis} = 4+1e-5
 5 print x , y , z , zbis
 6 z-zbis
 7 institute='UCL'
 8 institutebis="UCL"
 9 print institute , institutebis
10 print (institute+" "+institutebis)
11 v+institute
12 y*institute
13 x == 1
14 x = = 2
15 x<>2
16 type (x)
17 del x
18 x
19 range?
20 \times = range(5)
21 print x
```

Exercise: Write this small program in a script and write in comment what will be the type and the value of the variables x_1 ; x_2 ; x_3 and x_4 after executing this code:

```
1 a = 1.

2 b = 2.

3 m = 1

4 n = 2

5

6 x1 = a/b

7 x2 = m/n

8 x3 = m/b

9 x4 = a/n
```

Validate your results using the instruction type(variable)

More notes on integers

```
In [1]:int(3.4)
Out[1]:3
In [2]:int(3.9)
Out[2]:3
In [3]:int(round(3.4))
Out[3]:3
In [4]:int(round(3.9))
Out[4]:4
In [5]: round?
Type: builtin_function_or_method
String form: <built-in function round>
Namespace: Python builtin
Docstring:
round(number[, ndigits]) -> floating point number
Round a number to a given precision in decimal digits (default 0 digits).
This always returns a floating point number. Precision may be negative.
In [6]: round(3.2399817,6)
Out[6]: 3,239982
```

Variables

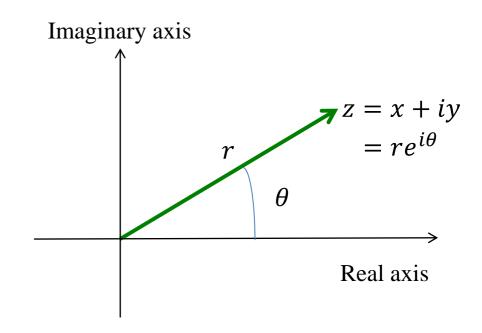
In programming languages generally, a variable name represents a value of a given type (int, float, etc.) stored in a fixed memory location. The value of a variable can be changed but not the variable type. This is not the case in Python where variables are *typed dynamically* as illustrated below

```
>>> x=3  # x is of type int
>>> print x
3
>>> x=x*2.0  # Now x is of type float
>>> print x
6.0
>>> __
```

Complex numbers C

Python has all the functions to manipulate complex numbers.

In Python
$$j = \sqrt{-1}$$



```
>>> sqrt(-4)
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
NameError: name 'sqrt' is not defined
>>> __
```

$$z = Re(z) + Im(z)j$$

cmath library

```
In [2]: from cmath import *
```

```
>>> print(sqrt(-4))
2j
>>>
```

This now makes use of all functions related to complex numbers. Gives the correct value of -2i

Calculations in C

We now have all the functions to manipulate complex numbers.

```
In [3]: (1+j)+(2+3j)

NameError Traceback (most recent call last)

<ipython-input-3-fa9966baf380> in <module>()

----> 1 (1+j)+(2+3j)

NameError: name 'j' is not defined
```

Now try the following

```
In [4]: (1+1j)+(2+3j)
Out[4]: (3+4j)
```

C Operations in Python

```
In [7]: print (1-2j)*(3+4j) # multiplication
(11-2j)
In [10]: print (1+2j)/(1-2j) # division
(-0.6+0.8j)
In [11]: (2+3j)**2 #squaring a complex number
Out[11]: (-5+12j)
In [17]: sqrt(1j)
Out[17]: (0.7071067811865476+0.7071067811865475j)
```

Other ways of handling C

```
Complex number z = x + iy can also be expressed
as a two-tuple z = (x, y) using complex (x, y)
z_1 = 2 + 3i is written as complex (2, 3)
z_2 = i is written as complex (0, 1)
z_3 = 1 is written as complex (1, 0)
         ⟩δ⟩ z1=complex(2,3)
           \rangle z2=complex(0,1)
           > print z1+z2
          >> print sqrt(z2)
               06781187+0.707106781187j)
```

More operations in \mathbb{C} -1

The length of z is the modulus given by

$$|z| = \sqrt{x^2 + y^2}$$

In Python the one parameter, absolute function written

gives the modulus of a complex number.

```
In [9]: z=complex(2,3)
In [10]: print abs(z) # mod z
3.60555127546
In [11]: |
```

More operations in \mathbb{C} -2

The argument of z, written arg(z) is the angle between z(x, y) and the real axis where

$$arg(z) = arctan\left(\frac{y}{x}\right)$$

The one parameter function

gives the argument in radians. The principal value is given, i.e. $-\pi \le arg(z) \le \pi$.

```
In [12]: phase(complex(0,1))
Out[12]: 1.5707963267948966
```

More operations in \mathbb{C} -3

Converting complex numbers from Cartesian (x, y) to polar form (r, θ) is a fairly straightforward mathematical exercise. How is this done in Python? A single argument function

```
polar(..) \longrightarrow (r,\theta); r=|z| and \theta=tan^{-1}(y/x)
```

- polar(x+yj)
- polar(complex(..,..))

```
In [13]: polar(0+1j)
Out[13]: (1.0, 1.5707963267948966)
In [14]: polar(complex(0,1))
Out[14]: (1.0, 1.5707963267948966)
```

Exercise

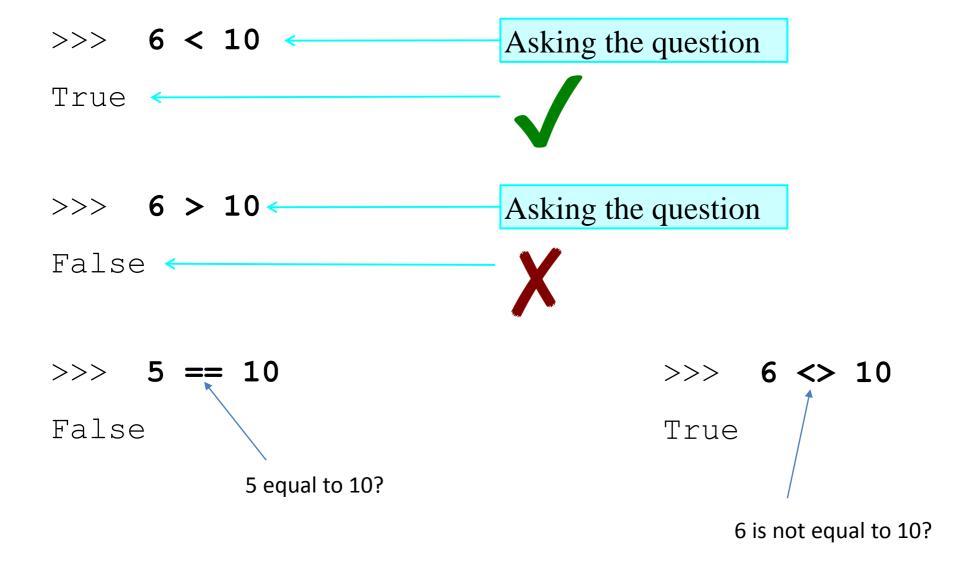
Evaluate and print out the following calculations:

$$2. \qquad (1+1/10)^{10}$$

3.
$$(1 + 1/100)^{100}$$

4.
$$(1 + 1/1000)^{1000}$$

Comparisons – Truth and Falsehood



True & False

```
>>> type (True)
                                 "Booleans"
<type 'bool'>
                                                int
int
         int
                               True
                                                bool
```

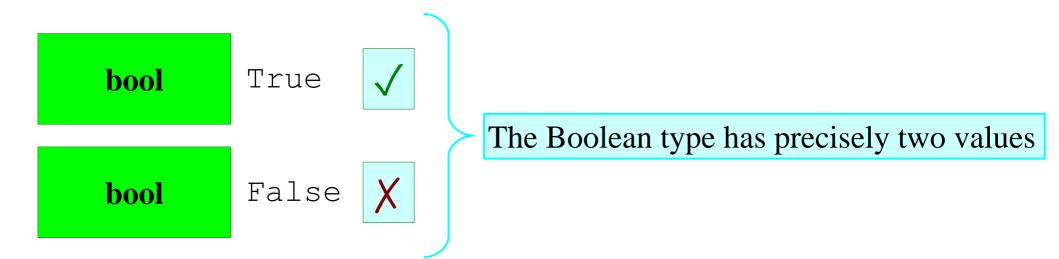
Check on type

```
In [1]: type(True)
Out[1]: bool
In [2]: type("Greetings")
Out[2]: str
In [3]: type(-5)
Out[3]: int
In [4]: type(3.14)
Out[4]: float
In [5]: type(3-4j)
Out[5]: complex
```

Examples

```
>>> type(pi)
<type 'float'>
>>> type(3<>4)
<type 'bool'>
>>> type((2+4j)**2)
<type 'complex'>
>>> type(2+12)
<type 'int'>
>>> type(3==3)
<type 'bool'>
>>>
```

True & False



Six comparison operators

Maths	Python	Meaning
=	==	equals
#	!= <>	not equal to
<	<	less than
>	>	greater than
<u><</u>	<=	less than or equal
<u>></u>	>=	greater than or equal

"Syntactic sugar"

A common question in maths: $x \in [a, b]$?

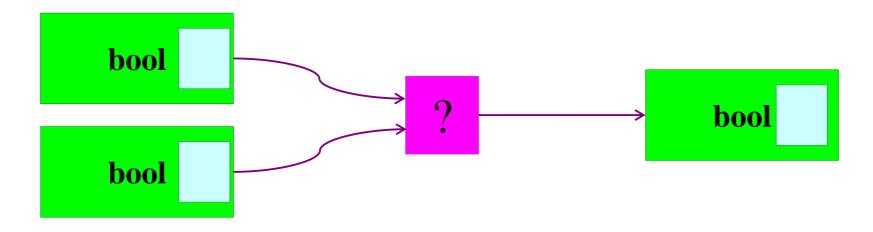
0 < number 0 < number < 10 and number < 10

>>> number = 4

>>> 0 < number < 10

True

Boolean operations



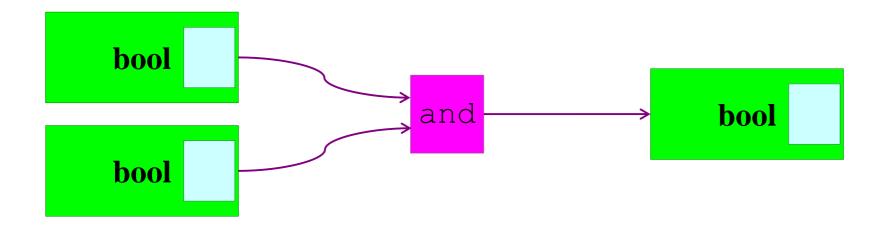
Numbers have arithmetic operations +, -, * ...

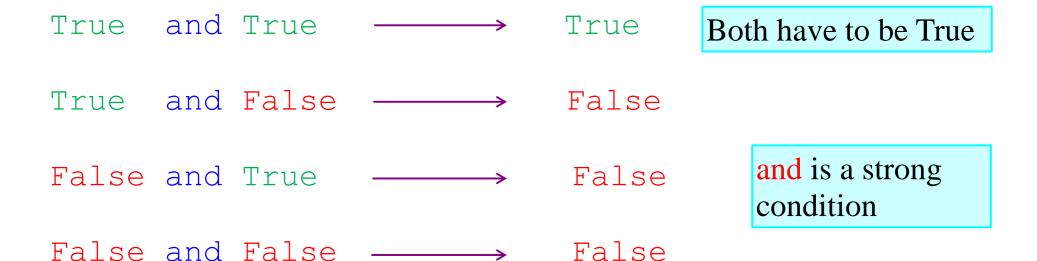
bool <

What operations do Booleans have?

bool X

Boolean operations — "and"



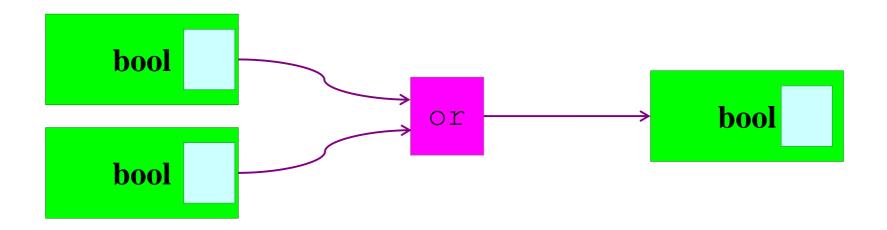


Boolean operations — "and"

Examples:

>>>
$$5 < 10$$
 and $6 < 8$ $5 < 10 \rightarrow True$ and $\rightarrow True$ $6 < 8 \rightarrow True$ $\rightarrow >>> $5 < 10$ and $6 > 8$ $5 < 10 \rightarrow True$ and $\rightarrow False$ False$

Boolean operations — "or"



True or True \longrightarrow True

True or False \longrightarrow True

False or True \longrightarrow True

False or False \longrightarrow False

At least one has to be True

Weaker condition than and

Boolean operations — "or"

>>>
$$5 < 10 \text{ or } 6 < 8$$

True

$$6 < 8 \longrightarrow \text{True}$$

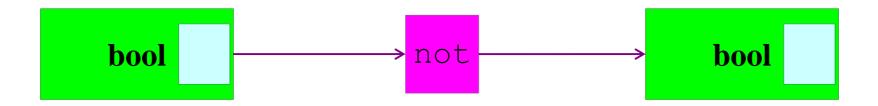
>>>
$$5 < 10 \text{ or } 6 > 8$$

5 < $10 \rightarrow \text{True}$

True

6 > $8 \rightarrow \text{False}$

Boolean operations — "not"



Boolean operations — "not"

>>> not 6 < 7

 $6 < 7 \longrightarrow True \longrightarrow False$

False

>>> not 6 > 7

 $6 > 7 \longrightarrow False - not \longrightarrow True$

True

"Order of precedence"

The precedence of logical operators is even lower than that of comparison operators.

Summary

Comparisons

Numerical comparison

Alphabetical ordering

Booleans

Boolean operators

Order of precedence

== != < > <= >=

5 < 7

'dig' < 'dug'

True False

and or not

Exercise

Predict whether these expressions will evaluate to True or False. Then try them.

$$3.$$
 60 - 45 / 5 + 10 == 1

Exercise

Predict the outcome in the following numerical examples and then run

```
Expression:
(6 \le 6) and (5 \le 3)
(6 \le 6) \text{ or } (5 \le 3)
(5 != 6)
(5 < 3) and (6 <= 6) or (5 != 6)
(5 < 3) and ((6 <= 6)) or (5 != 6))
not((5 < 3) and ((6 <= 6) or (5 != 6)))
```

"Syntactic sugar"

$$a+=b$$

$$a-=b$$

$$a^*=b$$

$$a /= b$$

$$a = a + b$$

$$a = a - b$$

$$a = a * b$$

$$a = a / b$$

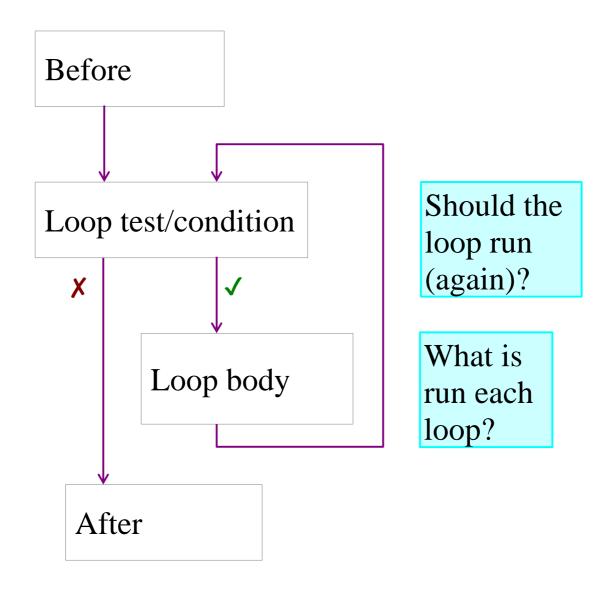
$$a = a ** b$$

$$a = a % b$$

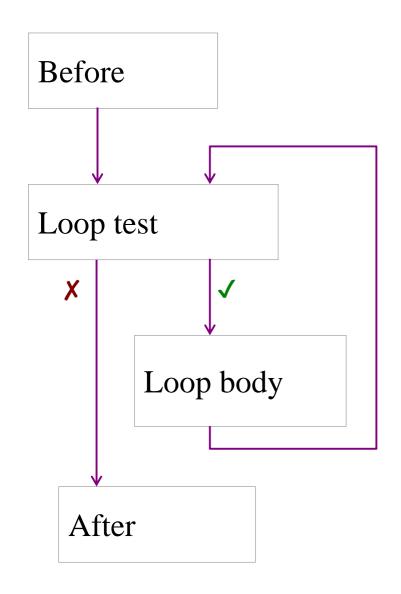
Deleting a name

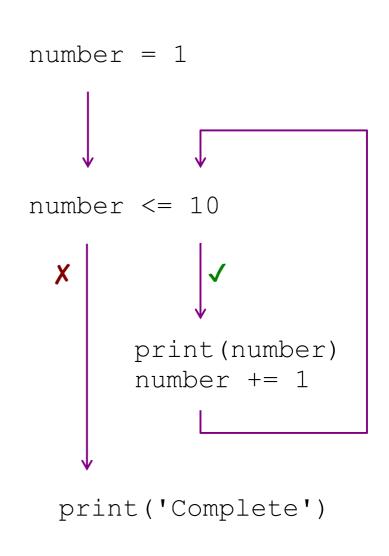
```
>>> print(value)
                                          Known
10 <
                                          variable
>>> del value
>>> print(thing)
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
NameError: name 'thing' is not defined
                                          Unknown
                                          variable
```

Loops – The mechanics



Loop example: Count from 1 to 10





Loop example: Count from 1 to 10

```
number = 1
                  keyword
while number <= 10 :</pre>
___print(number)
   number += 1
print('Done!')
```

```
number = 1
number \leq 10
       print(number)
       number += 1
  print('Done!')
```

Loop test: Count from 1 to 10

```
___print(number)
___number += 1
```

A loop becomes an infinite loop if a condition never becomes FALSE. Use caution with while loops.

```
print('Done!')
```

Loop body: Count from 1 to 10

```
number = 1
while number <= 10 :
____print(number)
                                    loop body
       number += 1
                                    Four spaces' indentation
                                    indicate a "block" of code.
print('Done!')
                                   The first unindented line
                                   marks the end of the block.
```

Loop example: Code and output

```
Editor - Canopy
File Edit View Search Run Tools Window
*untitled-1
   1 number=1
   2 while(number<=10):
        print(number)
        number+=1
   5 print('done')
Python
Welcome to Canopy's interactive data-analysis environment!
with pylab-backend set to: qt
Type '?' for more information.
In [41]: %run "c:\users\riaz\appdata\local\temp\tmpz_0jte.py"
2
6
8
done
In [42]:
```

For Loop for summing: code and output

```
1 n=input('Enter an upper limit: ')
2 sum=0
3 for n in range(1,n+1):
4     sum = sum + n**2
5     print n, sum

Python

In [71]: %run "c:\users\riaz\appdata\local\temp\tmp00rtkg.py"

Enter an upper limit 5
1 1
2 5
3 14
4 30
5 55
```

Keep looping while ...?

uncertainty > tolerance

while uncertainty > tolerance :

———Do stuff.

The "for loop" for adding

print(sum) <</pre>

Results after the loop

Lists

Lists are sequences of values, very similar to strings, except that each element can be of any type — they are *heterogeneous*. The syntax for creating a list is [......] where each element is separated with a ,

```
['American', 'Asian', 'Bermudan', 'Binary', ......]
[3.141592653589793, 1.5707963267948966, 0.0]
[2, 3, 5, 7, 11, 13, 17, 19]
```

Programs usually don't operate on single values, but on whole collections of them.

What is a list?

Consider the first list on the previous slide (more lengthier)

American, Asian, Bermudan, Binary, Cliquet, Lookback, Parisian, Passport, ..., Vanilla

A sequence of values

The names of option's contracts

Values stored in order

Alphabetic

Individual value identified by position in the sequence

"Binary" is the name of the element number 3 in the list

Creating a list in Python

```
In [7]: primes = [2, 3, 5, 7, 11, 13, 17, 19, 23, 29, 31, ...: 37, 41, 43, 47, 53, 59]
```

A sequence of values

The prime numbers less than sixty

Values stored in order

Numerical order

Individual value identified by position in the sequence

17 is the element number six

A list of irrationals

```
In [28]: irrational = [exp(1), sqrt(2), pi]
In [29]: print type(irrational)
<type 'list'>
In [30]: print irrational
[2.7182818284590451, 1.4142135623730951, 3.141592653589793]
In [31]: irrational[1]=sqrt(12)
In [32]: print irrational
[2.7182818284590451, 3.4641016151377544, 3.141592653589793]
```

Counting from the end – indexing from the back

```
>>> primes = [ 2, 3, 5, 7, 11, 13, 17, 19]
             [2, 3, 5, 7, 11, 13, 17, 19]
             -8 \quad -7 \quad -6 \quad -5 \quad -4 \quad -3 \quad -2 \quad -1
                             getting at the last item
>>> primes[-1]
```

Elements in a list can differ in <type>

4 elements of type int, float, character, float in turn

```
>>> l=[1,3.2,'h',pi]
>>> print type(l)
{type 'list'>
>>> l[0]='Riaz'
>>> print l
['Riaz', 3.2, 'h', 3.141592653589793]
```

First element in list changed to a string

Inserting element using list methods

List methods are an alternative, more readable way of inserting elements. append () adds an element to the end of a list:

```
In [1]: b = [0.1, 0.2]
In [2]: b.append(0.9)
In [3]: b
Out[3]: [0.1, 0.2, 0.9]

extend() appends all elements of another list:
In [4]: b.extend([7, 8])
In [5]: b
Out[5]: [0.1, 0.2, 0.9, 7, 8]

insert(i, x) inserts x before ith element:
In [6]: b.insert(1, 5)
```

```
In [6]: b.insert(1, 5)
In [7]: b
Out[7]: [0.1, 5, 0.2, 0.9, 7, 8]
```

Further insertion using list methods

List methods are an alternative, more readable way of inserting elements.

pop (i) removes and returns the i^{th} element:

```
In [1]: b = [0.1,0.2,0.3]
In [2]: b.pop(1) # removes 0.2 from list and returns value
Out [2]: 0.2
In[3]: b
Out[3]:[0.1, 0.3]
```

If pop () is called with no arguments, it removes the last element of the list.

Deletion from a list

The **del()** statement can be used to remove an element.

```
Using b = [0.1, 0.2, 0.3]
```

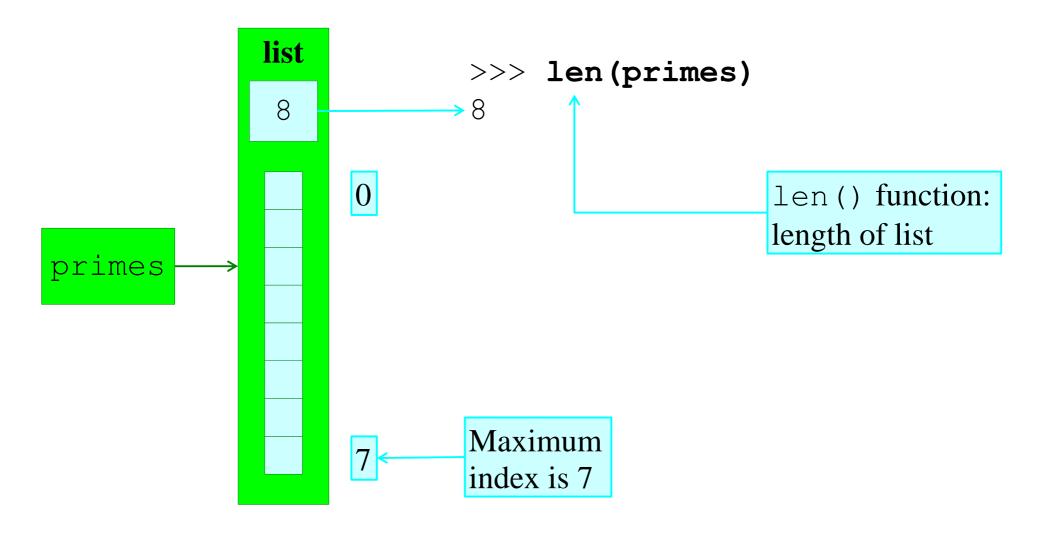
from the previous slide:

```
In [7]: del b[1]
```

In [8]: b

Out[8]: [0.1, 0.3]

Length of a list – use len



Tuples

Tuples are like lists, except that they cannot be modified once created, that is they are *immutable*. In Python, lists, are easily created using the syntax (...,

```
..., ...), Or even ..., ...:

>>> point = (4.5)
>>> print(point,type(point))
((4, 5), (type 'tuple'))

>>> point = 4.5
>>> print(point,type(point))
((4, 5), (type 'tuple'))
```

```
>> point = (1, 'r', pi)
>> print(point,type(point))
(1, 'r', 3.141592653589793), <type 'tuple'>>
```

Unpacking tuples

Tuples can be unpacked by assigning it to a commaseparated list of variables

```
1 point = 4, 5
2 x, y = point
3 print "x= ", x
4 print "y= ", y
```

Python

```
In [2]: %run "c:\users\riaz\appdata\local\temp\tmppwhndp.py"
x= 4
y= 5
```

Trying to assign a new value to an element in a tuple results in an error.

Simpler Tuples

To construct a **single-element** tuple, put an extra comma:

```
>>> cities = 'London',
>>> type(cities)
<type 'tuple'>
>>> _
```

An empty tuple is denoted by ()

```
>>> city = ()
>>> type(city)
<type 'tuple'>
```

Lists to Tuples

To **convert** a list to a tuple, use the function **tuple**():

```
In [3]: stuff = [7, 'xyz']
In [4]: tuple(stuff)
Out[4]: (7, 'xyz')
In [5]: stuffs=tuple(stuff)
In [5]: print stuffs
Out [5]: (7, 'xyz')
```

Indexing and slicing

Indexing and slicing works as for lists:

```
In [1]: address = 'UK', 'London', 'WC1E
6BT'
In [2]: address[1]
Out[2]: 'London'
In [3]: address[1][0:3]
Out[3]: 'Lon'
```

However assignment is not allowed. So e.g. the following is not allowed:

```
In [4]: address[2] = 'NW1 1AB'
```

Loops again!

In Python, loops can be programmed in a number of different ways. The most common is the for loop, which is used together with iterable objects, such as lists. The basic syntax is:

run ine current me

```
print(x)
Python
In [5]: %run "c:\users\riaz\appdata\local\temp\tmpll95tj.py"
In [6]:
    1 for x in [1,2,3]:
          v=2*x
          print(v)
Python
In [6]: %run "c:\users\riaz\appdata\local\temp\tmp2lhfz1.py"
```

1 for x in [1,2,3]:

The range () function

It is tedious to write:

In [1]:
$$a = [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]$$

This is shorter and equivalent:

```
In [2]: a = range (10)
```

range (n) returns the list of integers from 0 up to but not including n.
range (m, n) returns the list of integers from m up to but not
including n:

```
In [3]: range(5, 10)
```

Out[3]: [5, 6, 7, 8, 9]

range(m, n, s) returns the list containing every s^{th} integer from m up to but not including n:

```
In [4]: range(4, 10, 2)
```

Out[4]: [4, 6, 8]

Iteration over integers I

A common use case of range() is iteration over lists of integers.

```
1 for i in range(5):
         print i,"**2=",i**2
Python
In [4]: %run "c:\users\riaz\appdata\local\temp\tmpmkt5qi.py"
0 **2= 0
1 **2 = 1
2 **2= 4
3 **2= 9
4 **2= 16
range([start,] stop[, step]) -> list of integers
print range(1,10,2) prints out [1, 3, 5, 7, 9]
```

Iteration over integers II

```
1 for i in range(5):
        x=2*i
      y=i**2
         print i, x, y
Python
In [8]: %run "c:\users\riaz\appdata\local\temp\tmpo3s9d7.py"
0 0 0
2 4 4
3 6 9
4 8 16
```

Note range (5) does not include 5

Iteration over integers III

```
1 for i in range(-3,3):
         print i
Python
In [9]: %run "c:\users\riaz\appdata\local\temp\tmpnbjcrp.py"
-3
-2
-1
```

Again note range (3) does not include 3

Iteration over integers IV

Sometimes it is useful to have access to the indices of the values when iterating over a list. We can use the enumerate function for this:

```
1 for idx, x in enumerate(range(-3,3)):
         print idx, x
Python
In [11]: %run "c:\users\riaz\appdata\local\temp\tmpevgbzi.py"
0 - 3
1 - 2
5 2
```

Exercise

Track what is happening to this list at each stage. Do this initially by hand. After each line, work out what you think the numbers will be and then check by printing out.

```
>>>  numbers = [5, 7, 11, 13, 17, 19, 29, 31]
>>> numbers[1] = 3
>>> del numbers[3]
>>> numbers[3] = 37
>>> numbers[4] = numbers[5]
>>> numbers = [5, 7, 11, 13, 17, 19, 29, 31]
```

Using the append () method

```
>>> print(primes)
[2, 3, 5, 7, 11, 13, 17, 19]
>>> primes.append(23)
                               The function doesn't
                               return any value.
>>> primes.append(29)
>>> primes.append(31)
                               It modifies
>>> primes.append(37)
                               the list itself.
>>> print(primes)
[2, 3, 5, 7, 11, 13, 17, 19, 23, 29, 31, 37]
```

Other methods on lists: reverse ()

```
>>> numbers = [4, 7, 5, 1]

>>> numbers.reverse()
The function doesn't return any value.

>>> print(numbers)

[1, 5, 7, 4]
It modifies the list itself.
```

Other methods on lists: sort ()

```
>>> numbers = [4, 7, 5, 1]

>>> numbers.sort()
The function does not return the sorted list.

>>> print(numbers)

[1, 4, 5, 7]
It sorts the list itself.
```

Numerical order.

Other methods on lists: sort ()

```
>>> greek = ['alpha', 'delta', 'beta', 'gamma']
>>> greek.sort()
>>> print(greek)
['alpha', 'beta', 'delta', 'gamma']
```

Alphabetical order of the *words*.

Other methods on lists: insert()

```
>>> greek = ['alpha', 'gamma', 'delta']
>>> greek.insert(1, 'beta')
    Where to insert
                                 What to insert
>>> greek
['alpha', 'beta', 'gamma', 'delta']
                          Displaced
```

Other methods on lists: remove ()

```
>>> numbers = [7, 4, 8, 7, 2, 5, 4]
>>> numbers.remove(8)
>>> print(numbers)
[7, 4, 7, 2, 5, 4]
```

c.f. del numbers [2] \leftarrow Index to remove

Other methods on lists: remove ()

```
>>> print(numbers)
[7, 4, 7, 2, 5, 4]
                           There are two instances of 4.
>>> numbers.remove (4)
>>> print(numbers)
[7, 7, 2, 5, 4]
                           Only the first instance is removed
```

Adding to a list: "+"

```
>>> primes
[2, 3, 5, 7, 11, 13, 17, 19]
Concatenation
                            List to add
operator
>>> primes + [23, 29, 31]
[2, 3, 5, 7, 11, 13, 17, 19, 23, 29, 31]
```

Concatenation

```
Create a new list
>>> newlist = primes + [23, 29, 31]
                Update the list
>>> primes = primes + [23, 29, 31]
                Augmented assignment
>>> primes += [23, 29, 31]
```

Is an item in a list? — 1

```
>>>  odds = [3, 5, 7, 9] \leftarrow
                                            Does not include 2
                                            Try to remove 2
>>> odds.remove(2) <-
                                            Hard error
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
ValueError: list.remove(x): x not in list
                                            x must be in the
                                            list before it can
                                            be removed
```

Is an item in a list? — 2

>>> odds = [3, 5, 7, 9]

>>> 2 in odds

False

>>> 3 in odds

True

>>> 2 not in odds

True

Precedence

First

not x x and y x or y

Last

The list now contains every operator we meet in this course.

Ranges of numbers again

via list()

range(10) \longrightarrow [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]

Start at 0

range(3, 10) \longrightarrow [3, 4, 5, 6, 7, 8, 9]

range $(3, 10, 2) \longrightarrow [3, 5, 7, 9]$

Every n^{th} number

range (10, 3, -2) \longrightarrow [10, 8, 6, 4]

Negative steps

Indices of lists

```
>>> primes = [ 2, 3, 5, 7, 11, 13, 17, 19]
>>> len(primes)
8
>>> list(range(8))
[0, 1, 2, 3, 4, 5, 6, 7]
                               valid indices
     [2, 3, 5, 7, 11, 13, 17, 19]
```

Tuples as single objects — 1

```
>>> x = 20
>>> type(x)
<class 'int'>
>>> y = 3.14
>>> type(y)
<class 'float'>
>>> z = (20, 3.14)
                                One name \rightarrow Pair of values
>>> type(z)
<class 'tuple'>
                                A single object
```

Tuples as single objects — 2

```
>>> z = (20, 3.14)
>>> print(z)
(20, 3.14)
                                           Single name \rightarrow Single tuple
>>> \mathbf{w} = \mathbf{z} \leftarrow
>>> print(w)
(20, 3.14)
```

Splitting up a tuple

```
>>> print(z)
(20, 3.14)
>>> (a,b) = z
>>> print(a)
20
>>> print(b)
3.14
```

Two names \rightarrow Single tuple

How tuples are like lists

How tuples are *not* like lists

```
>>> z = (20, 3.14)

>>> z[0] = 10

Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
TypeError: 'tuple' object does not support item assignment "Immutable"
```

Additional downloadable modules

Numerical	Databases	
numpy	pyodbc	
scipy	psycopg2	PostgreSQL
	MySQLdb	MySQL
	cx_oracle	Oracle
Graphics	ibm_db	DB2
matplotlib	pymssql	SOL Server

Finding modules



Python: By

Built-in modules



SciPy:

Scientific Python modules



PyPI:

Python Package Index



Search:

"Python3 module for X"

Help with modules

```
>>> import math

>>> help(math)

NAME
    math

DESCRIPTION
    This module is always available. It provides access to the mathematical functions defined by the C standard.
```

. . .

Help with module functions

```
FUNCTIONS
  acos(x)
    Return the arc cosine (measured in
    radians) of x.
>>> math.acos(1.0)
0.0
```

Help with module constants

DATA

e = 2.718281828459045

pi = 3.141592653589793
....

>>> math.pi

3.141592653589793

Functions

$$y = f(x)$$

If it is appropriate to an object,

make it a method of that object.

Functions we have met and will meet

```
input(prompt)
                                bool (thing)
len (thing)
                                float (thing)
open (filename, mode)
                                int (thing)
print(line)
                                iter(list)
type (thing)
                                list(thing)
ord (char)
                                range (from, to, stride)
chr (number)
                                str(thing)
Not that many!
                                "The Python Way":
```

Why write our own functions?

Easier to ...

... read

... write

... test

... fix

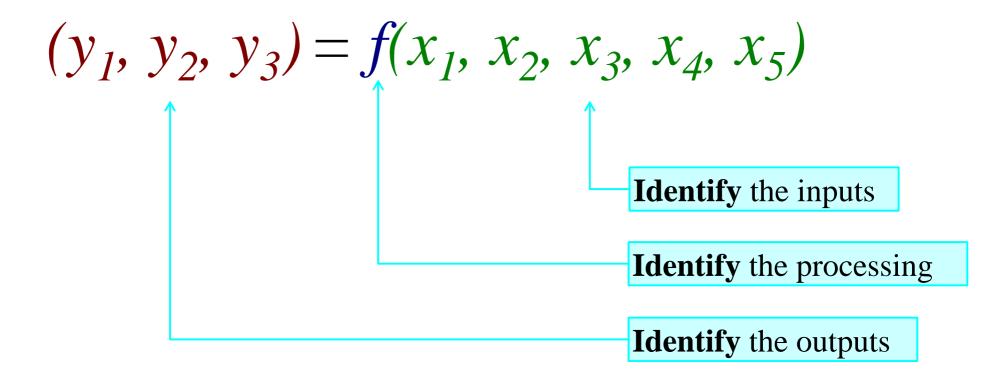
... improve

... add to

... develop

"Structured programming"

Defining a function



User defined functions

We now write our own functions. A function in Python is defined using the keyword def, followed by a function name, a signature within parentheses (), and a colon :

The following code, with one additional level of indentation, is the function body.

```
1 def PrintThis(string): #basic syntax for function header
2    print(string) #function definition; note the indent
3
4 # main body. No indents here
5 PrintThis("hello world") # function call with parameter
```

```
In [1]: %run "c:\users\riaz\appdata\local\temp\tmpmba_yb.py"
hello world
In [2]: |
```

Writing a maths function

```
1 def factorial(n):
2    factorial=1
3    for n in range(1,n+1):
4        factorial=factorial*n
5    return factorial
6
7 n=input('enter an integer value: ')
8 print n, ("factorial is"), factorial(n)
9 print type(factorial(n))
```

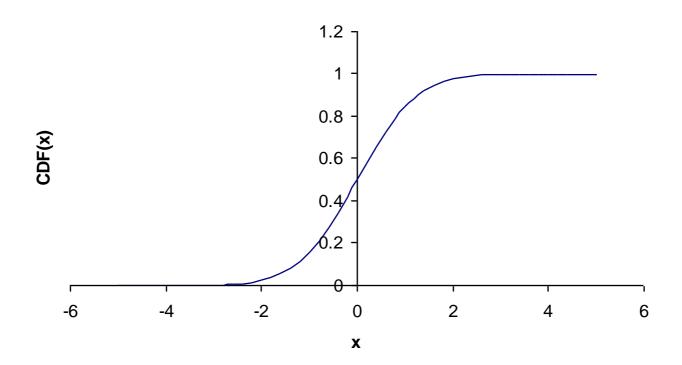
Python

```
In [42]: %run "c:\users\riaz\appdata\local\temp\tmppoyui8.py"
enter an integer value: 6
6 factorial is 720
<type 'int'>
In [43]: %run "c:\users\riaz\appdata\local\temp\tmpzjmg8t.py"
enter an integer value: 15
15 factorial is 1307674368000
<type 'long'>
In [44]:
```

Approximating a Cumulative Distribution Function (CDF)

A random variable $X \sim N(0,1)$ has CDF

$$N(x) = Pr(X < x) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{x} e^{-\frac{1}{2}s^{2}} ds$$



The Algorithm

We can approximate this improper integral by using the numerical scheme which is accurate to 6 decimal places

$$N(x) = \begin{cases} 1 - n(x)(a_1k + a_2k^2 + a_3k^3 + a_4k^4 + a_5k^5) & x \ge 0\\ 1 - N(-x) & x < 0 \end{cases}$$

Where

$$k = \frac{1}{1+0.2316419x} \quad \text{and}$$

$$a_1 = 0.319381530, a_2 = -0.356563782, a_3 = 1.781477937$$

$$a_4 = -1.821255978, a_5 = 1.330274429,$$

$$n(x) = \frac{1}{\sqrt{2\pi}}e^{-\frac{1}{2}x^2}$$

```
195
```

```
1 from math import
 3 # Cumulative normal distribution function
 4 def CDF(X):
5 # define the constants
   (a1,a2,a3,a4,a5) = (0.31938153, -0.356563782, 1.781477937, -1.821255978, 1.330274429)
   x = abs(X)
      k = 1.0/(1.0+0.2316419*x)
9
      n = 1.0/sqrt(2.0*pi)*exp(-x*x/2.0)
     N = 1.0-n*(a1*k+a2*k*k+a3*pow(k,3)+a4*pow(k,4)+a5*pow(k,5))
10
11
    if X<0:
   N = 1.0-N
12
13 return N
14 # ---- Fnd of Function -----
15
16
17 # ---- MAIN BODY -----
18
19 X = input("Type in a real value\n") # Input RV from keyboard
20 print CDF(X)
21
22 #---- End of Program -----
```

Input from keyboard - revised

The function raw_input() can be used to request information from the user via the keyboard.

Example: inputting text

```
>>> name = raw_input("What's your name? ")
What's your name? Riaz
>>> print("Hello, "+name+"!")
Hello, Riaz!
>>> __
```

More keyboard input - numerical

The function input () can be used to request information from the user via the keyboard.

Example: inputting numerical values

```
>>> r = input("enter the radius: ")
enter the radius: 2.0
>>> Area = pi*r**2
>>> print(Area)
12.5663706144
>>>
```

1 from math import * 2 # Cumulative normal distribution function 3 def CDF(X): # define the constants (a1,a2,a3,a4,a5) = (0.31938153, -0.356563782, 1.781477937, -1.821255978, 1.330274429)x = abs(X)7 k = 1.0/(1.0+0.2316419*x)n = 1.0/sqrt(2.0*pi)*exp(-x*x/2.0)9 N = 1.0-n*(a1*k+a2*k*k+a3*pow(k,3)+a4*pow(k,4)+a5*pow(k,5))10 **if** X<0: 11 N = 1.0-N12 return N 13 # 14 15 def d1(stock, strike, r, sigma, tau): Moneyness=log(float(stock)/strike,e) #remember to convert either to real 16 17 shift = r+0.5*sigma**218 d1=(Moneyness+shift*tau)/(sigma*sqrt(tau)) 19 20 return d1 21 22 23 def d2(d1, sigma, tau): d2=d1-sigma*sqrt(T-t) 24 25 return d2 26 27 def call_option(d1,d2,stock,strike,r,tau): return stock*CDF(d1)-exp(-r*tau)*strike*CDF(d2) 28 29 30 def put_option(d1,d2,stock,strike,r,tau): return -stock*CDF(-d1)+exp(-r*(T-t))*strike*CDF(-d2) 31 32 33 # ---- MAIN BODY -----34 35 stock = input("Enter the stock price: ") 36 strike = input("Enter the strike price: ") 37 r = input("Enter the risk-free interest rate: ") 38 sigma = input("What is the volatility of stock returns? ") 39 T = input("Enter the option's expiry: ") 40 t = input("What is t? ") 41 42 tau = T-t 43 d1 = d1(stock, strike, r, sigma, tau) 44 d2 = d2(d1, sigma, tau)45 46 print ("The call option value is,"), call_option(d1,d2,stock,strike,r,tau) 47 print ("The put option value is,"), put_option(d1,d2,stock,strike,r,tau)

OPTION PRICER

Numpy

The numpy package is used in almost all numerical computation using Python. The package provides high-performance vector, matrix and higher-dimensional data structures for Python. Its flagship object is the powerful N – dimensional array

```
>>> from numpy import*
```

You can also use one or more of:

```
>>> from numpy.linalg import*
>>> from numpy.fft import*
>>> from numpy.random import*
and others
```

Arrays

The most basic numpy data type.

Matrices are specialised 2-D arrays.

Types int, float, complex forms available

Example:
$$a = \begin{bmatrix} 1 & 2 \\ 3 & 4 \end{bmatrix}$$
, $b = \begin{bmatrix} 5 \\ 6 \end{bmatrix}$

```
In [1]: a = array([[1,2],[3,4]])
In [2]: b = array([5,6])
In [3]: print a
[[1 2]
  [3 4]]
In [4]: print b
[5 6]
```

Vector displayed in row form

Simple operations on arrays

$$a = \begin{bmatrix} 1 & 2 \\ 3 & 4 \end{bmatrix}, b = \begin{bmatrix} 5 \\ 6 \end{bmatrix}, c = \begin{bmatrix} 3 \\ 2 \end{bmatrix}$$

Example: $d = a \times b = \begin{bmatrix} 17 \\ 39 \end{bmatrix}$; $d \cdot c = \begin{bmatrix} 17,39 \end{bmatrix} \cdot \begin{bmatrix} 3,2 \end{bmatrix} = 129$

```
In [10]: a = array([[1,2],[3,4]])
In [11]: b = array([5,6])
In [12]: c = array([3,2])
In [13]: x=dot(a,b) # multiplying matrix a with vector b
In [14]: print x
[17 39]
In [15]: y=dot(x,c) # dot product between 2 vectors
In [16]: print y
129
In [17]: print a/a # dividing a matrix by itself
[[1 1]
[[1 1]]
```

Filling arrays with identical elements

```
In [57]: zeros(3)
Out[57]: array([ 0., 0., 0.])
In [58]: zeros((2,2), complex)
Out[58]:
array([[ 0.+0.j, 0.+0.j],
      [ 0.+0.j, 0.+0.j]])
In [59]: ones((2,3))
Out[59]:
array([[ 1., 1., 1.],
      [ 1., 1., 1.]])
```

Filling arrays with random numbers

rand: random numbers uniformly distributed between 0 and 1

```
In [61]: from numpy import *
In [62]: random.rand(2,4)
Out[62]:
array([[ 0.67453123,  0.93657846,  0.99895286,
  0.92551777],
       [ 0.94039688,  0.87847137,  0.72226492,
  0.46458222]])
```

nrand: Normal (Gaussian) distribution N(0,1)

```
In [63]: random.randn(2, 4)
Out[63]:
array([[-0.08604966, 1.21733818, 0.03500559,
-0.80032704],
       [ 1.16385875, -0.02708105, 1.73136033,
-1.51509177]])
```

Other standard distributions are also available

Indexing starts at zero!

$$b = \begin{bmatrix} b_0 \\ b_1 \end{bmatrix}$$
, A vector component b_i can be accessed in python as b[i]

$$a = \begin{bmatrix} a_{00} & a_{01} \\ a_{10} & a_{11} \end{bmatrix}$$
, A component a_{ij} can be accessed in python as a [i, j]

```
In [3]: print a[0,0] # referencing row 1 col 1
In [4]: print a[0,1] # referencing row 1 col 2
In [5]: print a[1,0] # referencing row 2 col 1
3
In [6]: print a[1,1] # referencing row 2 col 2
In [7]: print a[1,1]**2 # treat each cpt as any variable and perform operations
```

matplotlib – 2D and 3D plotting

matplotlib.pyplot is an amazing 2D and 3D graphics library containing a collection of command line style functions that make matplotlib work like MATLAB. The advantages of using this library include:

- As with Python, easy to get started
- Support for LATEX formatted labels and texts
- Superior levels of control of all aspects of high quality figures in many formats (e.g. PNG, PDF, SVG, EPS, PGF)

matplotlib – getting started

To get started, the easy way to include matplotlib in a Python program is with:

```
In [1]: from pylab import *
```

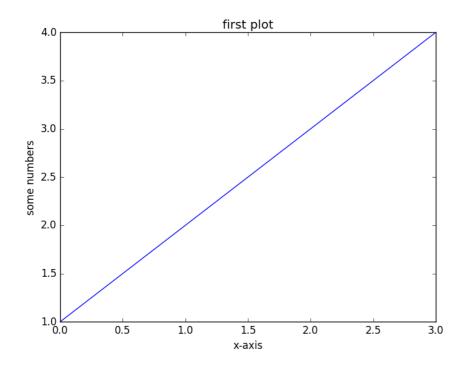
Can also have

```
In [2]: from matplotlib import *
```

The advantage of using matplotlib is being able to draw MATLAB still graphs.

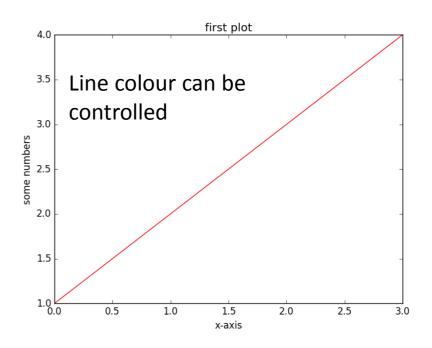
First Plot

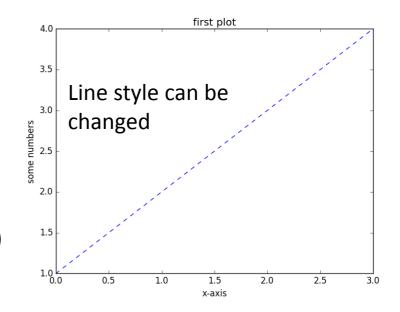
```
1 from pylab import *
2 plt.plot([1,2,3,4])
3 xlabel('x-axis')
4 ylabel('some numbers')
5 title('first plot')
6 show()
```



plot([1,2,3,4],'b--')

plot([1,2,3,4],'r')



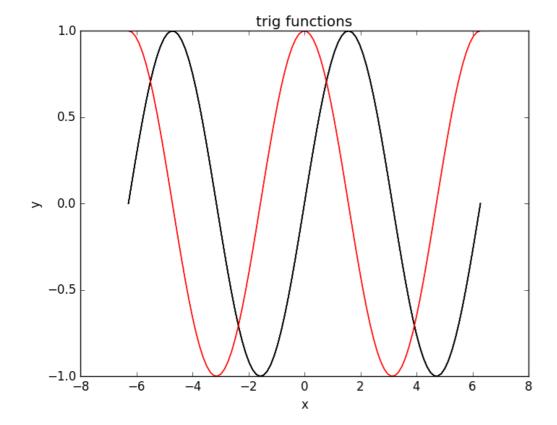


Nonlinear Plot - Quadratic

```
1 from pylab import *
2 \times = linspace(-5,5,50)
3 y=x**2
4 plot(x,y,'g')
5 xlabel('x')
                                                         y=x**2
                                25
6 ylabel('y')
7 title('y=x**2')
8 show()
                                20
                                15
                              >
                                10
                                 _6
                                                  -2
                                                           0
                                                           Х
```

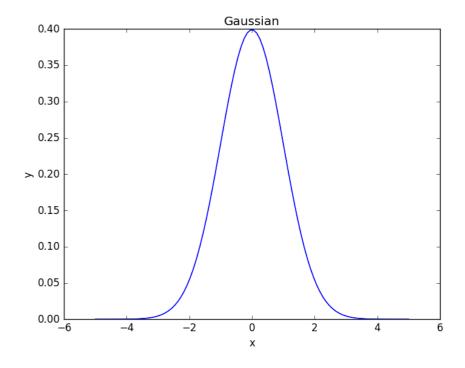
Nonlinear Plot – Trig functions

```
1 from pylab import *
2 x = linspace(-2*pi,2*pi,100)
3 y1=sin(x)
4 y2=cos(x)
5 plot(x,y1,'black')
6 plot(x,y2,'r')
7 xlabel('x')
8 ylabel('y')
9 title('trig functions')
10 show()
```



Plotting a Gaussian

```
1 from math import *
2 from pylab import *
3 x=linspace(-5,5,100)
4 y= (1/sqrt(2*pi))*exp(-0.5*x**2)
5 xlabel('x')
6 ylabel('y')
7 title('Gaussian')
8 plot(x,y,'blue')
9 show()
```



Sympy – Symbolic algebra in Python

Sympy is one of two Computer Algebra Systems (CAS) for Python. To get started, import the module sympy:

```
In [1]: from sympy import *
```

To get beautiful LATEX formatted output, simply run:

```
In [2]: init_printing()
```

Symbolic Variables: In SymPy we need to create symbols for the variables we want to work with. This can be done using the **Symbol** class.

Use of Symbolic Variables

```
In [3]: x=Symbol('x')

In [4]: from math import *

In [5]: (pi+x)**2
Out[5]:

(x+3.14159265358979)^2

In [6]: # alternative way of defining multiple symbols

In [7]: a,b,c=symbols("a,b,c")

In [8]: type(a)
Out[8]: sympy.core.symbol.Symbol
```

We can add assumptions to variables when we create them:

```
In [10]: x=Symbol('x', real=True)
In [11]: x.is_imaginary
Out[11]: False
In [12]: x=Symbol('x', positive=True)
In [13]: x>0
Out[13]:
True
```

Complex Numbers

The imaginary unit $i = \sqrt{-1}$ denoted I in SymPy:

```
In [20]: 1+1*I
Out[20]:
1+i
In [21]: I**2
Out[21]:
-1
                           There should
                           be no space
In [22]: (1+1*I)*(2+3*I)
Out[22]:
(1+i)(2+3i)
In [23]: expand (1+1*I)*(2+3*I)
Out[23]:
(1+i)(2+3i)
In [24]: expand((1+1*I)*(2+3*I))
Out[24]:
-1 + 5i
```

```
In [29]: complex(0,4)
Out[29]: 4j
In [30]: (-1+5*I)+complex(0,4)
Out[30]:
-1 + 9.0i
                     We can combine
                     formats!
In [31]: (x*I+1)**2
Out[31]:
(ix+1)^2
```

Rational Numbers

```
In [35]: r1=Rational(2,3)
In [36]: r2=Rational(4,5)
In [37]: r1
Out[37]:
\frac{2}{3}
In [38]: r2
Out[38]:
4
5
In [39]: r1+r2
Out[39]:
\frac{22}{15}
In [40]: r2-r1
Out[40]:
In [41]: r2/r1
Out[41]:
5
In [42]: 9*r1
Out[42]:
6
```

There are three different numerical types in SymPy: Real, Rational, Integer:

Algebraic Manipulations

A main use of CAS is to perform algebraic manipulations of expressions. For example, we may wish to expand a product, factor an expression, or simplify an expression. The functions for doing these basic operations in SymPy are demonstrated below:

> Expand and factor

```
In [9]: a,b,c,x=symbols("a,b,c,x")
In [10]: init_printing()
In [11]: (x+1)*(x+2)*(x+3)
Out[11]:
(x+1)(x+2)(x+3)
In [13]: sin(a+b)
Out[13]:
\sin(a+b)
In [14]: expand(sin(a+b), trig=True)
Out[14]:
\sin(a)\cos(b) + \sin(b)\cos(a)
```

```
In [15]: factor(x**3+6*x**2+11*+6)
Out[15]:
x^3 + 6x^2 + 66
In [16]: factor(x**2+2*x+1)
Out[16]:
(x+1)^2
In [17]: factor(x**3+6*x**2+11*x+6)
Out[17]:
(x+1)(x+2)(x+3)
In [19]: expand(tan(a+b), trig=True)
Out[19]:
```

Simplify

The simplify function attempts to simplify an expression into a set of nicer looking smaller terms using various techniques. More specific simplification alternatives to the simplify functions also exist: trigsimp, powsimp, logcombine, etc

```
In [20]: simplify((x**3+6*x**2+11*x+6))
Out[20]:
x^3 + 6x^2 + 11x + 6
In [21]: simplify((sin(a)**2+cos(a)**2))
Out[21]:
 1
In [23]: simplify(sin(pi/2-x))
Out[23]:
\cos(x)
In [24]: simplify(cos(x)/sin(x))
Out[24]:
```

Calculus I – Differentiation I

A powerful feature of CAS is its Calculus functionality like derivatives and integrals of algebraic expressions

➤ **Differentiation** – Use the diff function. The first argument is the expression to take the derivative of, and the second is the symbol by which to take the derivative:

```
New function defined
In [54]: y=(x+pi)**4
In [55]: y
Out[55]:
(x+\pi)^4
In [56]: dy_dx = diff(y,x) \leftarrow
                                             Differentiate y wrt x once
In [57]: dy_dx
Out[57]:
4(x+\pi)^3
                                            Differentiate y wrt x twice
In [58]: diff(y,x,x) _____
Out[58]:
12(x+\pi)^2
                                              Differentiate y wrt x three
In [59]: diff(y,x,x,x)
Out[59]:
                                              times
24(x + \pi)
```

Calculus I – Differentiation II

Trig functions and transcendental functions can also be differentiated

```
New function defined
In [61]: y=exp(x)*sin(x)
In [62]: diff(y,x)
                                                  Differentiate y wrt x once
Out[62]:
e^x \sin(x) + e^x \cos(x)
In [63]: diff(y,x,x)
                                                    Differentiate y twice wrt x
Out[63]:
2e^x\cos(x)
                                                New function defined
In [64]: v=3**x
In [65]: diff(y,x)
Out[65]:
                                                 \frac{d^n y}{dx^n} = \text{diff}(y,x,n)
3^x \log(3)
In [66]: y=ln(tan(x))
                                                  where n is the order of
In [67]: diff(y,x)
Out[67]:
                                                  differentiation
\tan^2(x) + 1
```

Calculus I – Differentiation III

We can do partial differentiation on multivariate functions

```
In [70]: x,y,z=symbols("x,y,z")
In [71]: f=\sin(x*y)+\cos(y*z)+\exp(x*z)
In [74]: diff(f,x)
Out[74]:
y\cos(xy) + ze^{xz}
In [75]: diff(f,y)
Out[75]:
x\cos(xy) - z\sin(yz)
In [76]: diff(f,z)
Out[76]:
xe^{xz} - y\sin(yz)
In [77]: diff(f,x,y)
Out[77]:
-xy\sin(xy) + \cos(xy)
In [78]: diff(f,y,x)
Out[78]:
-xy\sin(xy) + \cos(xy)
```

Calculus II – Integration I

Integration is done in a similar fashion using the function integrate ()

```
In [93]: y=sin(x)
In [94]: integrate(y,(x,0,pi/2))
Out[94]:
In [95]: y=sin(x)
In [96]: integrate(y,x) # indefinite integral
Out[96]:
-\cos(x)
In [97]: integrate(y,(x,0,pi/2)) # now use limits 0 to pi/2
Out[97]:
In [98]: f=exp(-x**2)
In [99]: integrate (f,(x,-oo,oo)) # also improper integarls
Out[99]:
\sqrt{\pi}
```

Note that oo is the SymPy notation for infinity

Exercises

- 1. Write a program that returns the Celsius C value for a given temperature measured in Fahrenheit F. The relation between these two is given by 5(F-32)=9C. As an example, the input 50 returns 10.
- 2. The time period *T* for a simple pendulum can be determined from
- $T=2\pi\sqrt{\frac{l}{g}}$, where l is the length of string and g (= 9.81 ms^{-2}) is the constant acceleration due to gravity. Write a program to determine T for varying lengths of string.
- 3. Calculate the PV of £5400 in three years time given the constant risk-free interest rate is 3.4%.
- 4. How much is £25000 worth in five years time if the constant risk-free interest rate is 4.4% with continuous compounding.
- 5. Experiment with different mathematical functions from the math module by writing various mathematical scripts.
- 6. Write programs to check the following formulae by inputting n (your choice) and then computing and comparing both sides of the equation

a.
$$\sum_{i=1}^{n} i = \frac{n(n+1)}{2}$$
 b. $\sum_{i=1}^{n} i^2 = \frac{n(n+1)(2n+1)}{6}$ b. $\sum_{i=1}^{n} i^3 = \frac{n^2(n+1)^2}{4}$

More exercises to follow!

There will be a further course in September!