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Introduction to Python - available from https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git
The original version was written by Rajath Kumar and is available at
https://github.com/rajathkumarmp/Python-Lectures. The notes have been updated for Python 3
and amended for use in Monash University mathematics courses by Andreas Ernst

1 Python-Lectures

1.1 Introduction

Python is a modern, robust, high level programming language. It is very easy to pick up even if you are completely new to programming.

Python, similar to other languages like matlab or R, is interpreted hence runs slowly compared to C++, Fortran or Java. However writing programs in Python is very quick. Python has a very large collection of libraries for everything from scientific computing to web services. It caters for object oriented and functional programming with module system that allows large and complex applications to be developed in Python.

These lectures are using jupyter notebooks which mix Python code with documentation. The python notebooks can be run on a webserver or stand-alone on a computer.

To give an indication of what Python code looks like, here is a simple bit of code that defines a set $N = \{1, 3, 4, 5, 7\}$ and calculates the sum of the squared elements of this set:

$$\sum_{i \in N} i^2 = 100$$

1.2 Contents

This course is broken up into a number of notebooks (chapters).

- 00 This introduction with additional information below on how to get started in running python
- 01 Basic data types and operations (numbers, strings)
- 02 String manipulation
- 03 Data structures: Lists and Tuples
- 04 Data structures (continued): dictionaries
- 05 Control statements: if, for, while, try statements
- 06 Functions
- 07 Classes and basic object oriented programming
- 08 Scipy: libraries for arrays (matrices) and plotting

This is a tutorial style introduction to Python. For a quick reminder / summary of Python syntax the following Quick Reference Card may be useful. A longer and more detailed tutorial style introduction to python is available from the python site at: https://docs.python.org/3/tutorial/

1.3 Installation

1.3.1 Loging into the web server

The easiest way to run this and other notebooks for staff and students at Monash University is to log into the Jupyter server at [https://sci-web17-v01.ocio.monash.edu.au/hub]. The steps for running notebooks are: * Log in using your monash email address. The first time you log in an empty account will automatically be set up for you. * Press the start button (if prompted by the system) * Use the menu of the jupyter system to upload a .ipynb python notebook file or to start a new notebook.

1.3.2 Installing

Python runs on windows, linux, mac and other environments. There are many python distributions available. However the recommended way to install python under Microsoft Windows or Linux is to use the Anaconda distribution available at [https://www.continuum.io/downloads]. Make sure to get the Python $\underline{3.5}$ version, not 2.7. This distribution comes with the SciPy collection of scientific python tools as well as the iron python notebook. For developing python code without notebooks consider using spyder (also included with Anaconda)

To open a notebook with anaconda installed, from the terminal run:

ipython notebook

Note that for the Monash University optimisation course additional modules relating to the commercial optimisation library CPLEX and possibly Gurobi will be used. These libraries are not available as part of any standard distribution but are available under academic licence and are included on the Monash server.

1.4 How to learn from this resource?

Download all the notebooks from Moodle or https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git Upload them to the monash server and lauch them or launch ipython notebook from the folder which contains the notebooks. Open each one of them

```
Cell > All Output > Clear
```

This will clear all the outputs and now you can understand each statement and learn interactively.

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All of these python notebooks are available at [https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git]

2 Getting started

Python can be used like a calculator. Simply type in expressions to get them evaluated.

2.1 Basic syntax for statements

The basic rules for writing simple statments and expressions in Python are: * No spaces or tab characters allowed at the start of a statement: Indentation plays a special role in Python (see the section on control statements). For now simply ensure that all statements start at the beginning of the line. * The '#' character indicates that the rest of the line is a comment * Statements finish at the end of the line: * Except when there is an open bracket or paranthesis:

```
1+2
+3 #illegal continuation of the sum
(1+2
+ 3) # perfectly OK even with spaces
```

• A single backslash at the end of the line can also be used to indicate that a statement is still incomplete

```
1 + \
2 + 3 # this is also OK
```

The jupyter notebook system for writting Python intersperses text (like this) with Python statements. Try typing something into the cell (box) below and press the 'run cell' button above (triangle+line symbol) to execute it.

```
In [1]: 1+2+3
Out[1]: 6
```

Python has extensive help built in. You can execute help() for an overview or help(x) for any library, object or type x to get more information. For example:

```
In [ ]: help()
```

Welcome to Python 3.5's help utility!

If this is your first time using Python, you should definitely check out the tutorial on the Internet at http://docs.python.org/3.5/tutorial/.

Enter the name of any module, keyword, or topic to get help on writing Python programs and using Python modules. To quit this help utility and return to the interpreter, just type "quit".

To get a list of available modules, keywords, symbols, or topics, type "modules", "keywords", "symbols", or "topics". Each module also comes with a one-line summary of what it does; to list the modules whose name or summary contain a given string such as "spam", type "modules spam".

help> keywords

Here is a list of the Python keywords. Enter any keyword to get more help.

```
False
                     def
                                          if
                                                               raise
None
                     del
                                          import
                                                               return
                     elif
True
                                          in
                                                               try
and
                     else
                                          is
                                                               while
                                          lambda
                                                               with
ลร
                     except
                     finally
                                          nonlocal
                                                               yield
assert
break
                     for
                                          not
class
                     from
                                          or
continue
                     global
                                          pass
```

```
help> False
Help on bool object:
class bool(int)
```

 \mid bool(x) -> bool

```
Returns True when the argument x is true, False otherwise.
The builtins True and False are the only two instances of the class bool.
The class bool is a subclass of the class int, and cannot be subclassed.
```

```
Method resolution order:
    bool
     int
     object
Methods defined here:
__and__(self, value, /)
    Return self&value.
__new__(*args, **kwargs) from builtins.type
     Create and return a new object. See help(type) for accurate signature.
__or__(self, value, /)
    Return self|value.
__rand__(self, value, /)
    Return value&self.
__repr__(self, /)
    Return repr(self).
_ror_(self, value, /)
    Return value|self.
__rxor__(self, value, /)
    Return value self.
__str__(self, /)
    Return str(self).
__xor__(self, value, /)
    Return self^value.
Methods inherited from int:
_abs__(self, /)
    abs(self)
__add__(self, value, /)
    Return self+value.
__bool__(self, /)
    self != 0
__ceil__(...)
     Ceiling of an Integral returns itself.
__divmod__(self, value, /)
    Return divmod(self, value).
__eq__(self, value, /)
    Return self == value.
```

```
__float__(self, /)
    float(self)
__floor__(...)
    Flooring an Integral returns itself.
__floordiv__(self, value, /)
    Return self//value.
__format__(...)
    default object formatter
__ge__(self, value, /)
    Return self>=value.
__getattribute__(self, name, /)
    Return getattr(self, name).
__getnewargs__(...)
__gt__(self, value, /)
    Return self>value.
_hash__(self, /)
    Return hash(self).
__index__(self, /)
    Return self converted to an integer, if self is suitable for use as an index into a list.
__int__(self, /)
    int(self)
__invert__(self, /)
    ~self
__le__(self, value, /)
    Return self<=value.
__lshift__(self, value, /)
    Return self<<value.
__lt__(self, value, /)
    Return self<value.
_mod__(self, value, /)
    Return self%value.
__mul__(self, value, /)
    Return self*value.
__ne__(self, value, /)
    Return self!=value.
```

```
_neg__(self, /)
     -self
__pos__(self, /)
    +self
__pow__(self, value, mod=None, /)
    Return pow(self, value, mod).
__radd__(self, value, /)
    Return value+self.
__rdivmod__(self, value, /)
    Return divmod(value, self).
__rfloordiv__(self, value, /)
    Return value//self.
__rlshift__(self, value, /)
    Return value << self.
__rmod__(self, value, /)
    Return value%self.
__rmul__(self, value, /)
    Return value*self.
__round__(...)
    Rounding an Integral returns itself.
    Rounding with an ndigits argument also returns an integer.
__rpow__(self, value, mod=None, /)
    Return pow(value, self, mod).
__rrshift__(self, value, /)
    Return value>>self.
__rshift__(self, value, /)
    Return self>>value.
__rsub__(self, value, /)
    Return value-self.
__rtruediv__(self, value, /)
    Return value/self.
__sizeof__(...)
    Returns size in memory, in bytes
__sub__(self, value, /)
    Return self-value.
__truediv__(self, value, /)
    Return self/value.
```

```
__trunc__(...)
    Truncating an Integral returns itself.
bit_length(...)
    int.bit_length() -> int
    Number of bits necessary to represent self in binary.
    >>> bin(37)
    '0b100101'
    >>> (37).bit_length()
conjugate(...)
    Returns self, the complex conjugate of any int.
from_bytes(...) from builtins.type
    int.from_bytes(bytes, byteorder, *, signed=False) -> int
    Return the integer represented by the given array of bytes.
    The bytes argument must be a bytes-like object (e.g. bytes or bytearray).
    The byteorder argument determines the byte order used to represent the
    integer. If byteorder is 'big', the most significant byte is at the
    beginning of the byte array. If byteorder is 'little', the most
    significant byte is at the end of the byte array. To request the native
    byte order of the host system, use 'sys.byteorder' as the byte order value.
    The signed keyword-only argument indicates whether two's complement is
    used to represent the integer.
to_bytes(...)
    int.to_bytes(length, byteorder, *, signed=False) -> bytes
    Return an array of bytes representing an integer.
    The integer is represented using length bytes. An OverflowError is
    raised if the integer is not representable with the given number of
    bytes.
    The byteorder argument determines the byte order used to represent the
    integer. If byteorder is 'big', the most significant byte is at the
    beginning of the byte array. If byteorder is 'little', the most
    significant byte is at the end of the byte array. To request the native
    byte order of the host system, use 'sys.byteorder' as the byte order value.
    The signed keyword-only argument determines whether two's complement is
    used to represent the integer. If signed is False and a negative integer
    is given, an OverflowError is raised.
Data descriptors inherited from int:
```

```
denominator
the denominator of a rational number in lowest terms
imag
the imaginary part of a complex number
numerator
the numerator of a rational number in lowest terms
real
the real part of a complex number
```

3 Variables & Values

A name that is used to denote something or a value is called a variable. In python, variables can be declared and values can be assigned to it as follows,

```
In [32]: x = 2  # anything after a '#' is a comment
    y = 5
    xy = 'Hey'
    print(x+y, xy) # not really necessary as the last value in a bit of code is displayed by defau
7 Hey
```

Multiple variables can be assigned with the same value.

The basic types build into Python include float (floating point numbers), int (integers), str (unicode character strings) and bool (boolean). Some examples of each:

Triple quotes (also with '''), allow strings to break over multiple lines. Alternatively

```
is a newline character ( for tab, \ is a single backslash)
```

Python also has complex numbers that can be written as follows. Note that the brackets are required.

4 Operators

4.1 Arithmetic Operators

Symbol	Task Performed
+	Addition
-	Subtraction
/	division
%	mod
	multiplication
//	floor division
	to the power of

```
In [36]: 1+2
Out[36]: 3
In [37]: 2-1
Out[37]: 1
In [38]: 1*2
Out[38]: 2
In [39]: 3/4
Out[39]: 0.75
  In many languages (and older versions of python) 1/2 = 0 (truncated division). In Python 3 this behaviour
is captured by a separate operator that rounds down: (ie a // b= \left|\frac{a}{b}\right|)
In [40]: 3//4.0
Out[40]: 0.0
In [41]: 15%10
Out[41]: 5
  Python natively allows (nearly) infinite length integers while floating point numbers are double precision
numbers:
In [42]: 11**300
In [43]: 11.0**300
       OverflowError
                                                Traceback (most recent call last)
       <ipython-input-43-1453d90b43cf> in <module>()
    ---> 1 11.0**300
```

4.2 Relational Operators

OverflowError: (34, 'Numerical result out of range')

Symbol	Task Performed
==	True, if it is equal
!=	True, if not equal to
<	less than
>	greater than
<=	less than or equal to
>=	greater than or equal to

Note the difference between == (equality test) and = (assignment)

```
In [44]: z = 2
    z == 2

Out[44]: True
In [45]: z > 2
Out[45]: False
```

Comparisons can also be chained in the mathematically obvious way. The following will work as expected in Python (but not in other languages like C/C++):

```
In [46]: 0.5 < z <= 1
Out[46]: False</pre>
```

4.3 Boolean and Bitwise Operators

```
| \mbox{Operator}| \mbox{Meaning} \mid | \mbox{Symbol} \mid \mbox{Task Performed} \mid | \mbox{$-|$} - | \mbox{$|$} - | \mbox{$|$} | \mbox{$|$} - | \mbox{$|$} | \mbox{$|$} - | \mbox{$|$} | \mbox
```

5 Built-in Functions

Python comes with a wide range of functions. However many of these are part of stanard libraries like the math library rather than built-in.

5.1 Converting values

Conversion from hexadecimal to decimal is done by adding prefix $\mathbf{0}\mathbf{x}$ to the hexadecimal value or vice versa by using built in $\mathbf{hex}(\)$, Octal to decimal by adding prefix $\mathbf{0}$ to the octal value or vice versa by using built in function $\mathbf{oct}(\)$.

```
In [49]: hex(170)
Out[49]: 'Oxaa'
In [50]: OxAA
Out[50]: 170
```

int() converts a number to an integer. This can be a single floating point number, integer or a string.
For strings the base can optionally be specified:

```
In [51]: print(int(7.7), int('111',2),int('7'))
7 7 7
Similarly, the function str() can be used to convert almost anything to a string
In [52]: print(str(True),str(1.2345678),str(-2))
True 1.2345678 -2
```

5.2 Mathematical functions

Mathematical functions include the usual suspects like logarithms, trigonometric functions, the constant π and so on.

5.3 Simplifying Arithmetic Operations

round() function rounds the input value to a specified number of places or to the nearest integer.

complex() is used to define a complex number and abs() outputs the absolute value of the same.

5.385164807134504

divmod(x,y) outputs the quotient and the remainder in a tuple (you will be learning about it in the further chapters) in the format (quotient, remainder).

```
In [63]: divmod(9,2)
Out[63]: (4, 1)
```

5.4 Accepting User Inputs

input(prompt), prompts for and returns input as a string. A useful function to use in conjunction with this is **eval()** which takes a string and evaluates it as a python expression.

All of these python notebooks are available at [https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git]

6 Working with strings

6.1 The Print Statement

As seen previously, The **print()** function prints all of its arguments as strings, separated by spaces and follows by a linebreak:

```
- print("Hello World")
- print("Hello",'World')
- print("Hello", <Variable Containing the String>)
```

Note that **print** is different in old versions of Python (2.7) where it was a statement and did not need parenthesis around its arguments.

```
In [2]: print("Hello","World")
Hello World
```

The print has some optional arguments to control where and how to print. This includes **sep** the separator (default space) and **end** (end charcter) and **file** to write to a file.

```
In [3]: print("Hello","World",sep='...',end='!!')
Hello...World!!
```

6.2 String Formating

There are lots of methods for formating and manipulating strings built into python. Some of these are illustrated here.

String concatenation is the "addition" of two strings. Observe that while concatenating there will be no space between the strings.

```
In [6]: string1='World'
    string2='!'
    print('Hello' + string1 + string2)
```

HelloWorld!

The % operator is used to format a string inserting the value that comes after. It relies on the string containing a format specifier that identifies where to insert the value. The most common types of format specifiers are:

```
- %s -> string
- %d -> Integer
- %f -> Float
- %o -> Octal
- %x -> Hexadecimal
- %e -> exponential
In [7]: print("Hello %s" % string1)
       print("Actual Number = %d" %18)
       print("Float of the number = %f" %18)
       print("Octal equivalent of the number = %0" %18)
        print("Hexadecimal equivalent of the number = %x" %18)
        print("Exponential equivalent of the number = %e" %18)
Hello World
Actual Number = 18
Float of the number = 18.000000
Octal equivalent of the number = 22
Hexadecimal equivalent of the number = 12
Exponential equivalent of the number = 1.800000e+01
   When referring to multiple variables parenthesis is used. Values are inserted in the order they appear in
the paranthesis (more on tuples in the next lecture)
In [8]: print("Hello %s %s. This meaning of life is %d" %(string1,string2,42))
Hello World!
  We can also specify the width of the field and the number of decimal places to be used. For example:
In [10]: print('Print width 10: |%10s|'%'x')
         print('Print width 10: |%-10s|'%'x') # left justified
         print("The number pi = %.2f to 2 decimal places"%3.1415)
         print("More space pi = %10.2f"%3.1415)
         print("Pad pi with 0 = \%010.2f"\%3.1415) # pad with zeros
Print width 10: |
Print width 10: |x
The number pi = 3.14 to 2 decimal places
More space pi =
Pad pi with 0 = 0000003.14
6.3
     Other String Methods
Multiplying a string by an integer simply repeats it
In [12]: print("Hello World! "*5)
Hello World! Hello World! Hello World! Hello World!
  Strings can be tranformed by a variety of functions:
In [16]: s="hello wOrld"
         print(s.capitalize())
         print(s.upper())
         print(s.lower())
         print('|%s|' % "Hello World".center(30)) # center in 30 characters
         print('|%s|'% "
                            lots of space
                                                        ".strip()) # remove leading and trailing whitesp
         print("Hello World".replace("World","Class"))
```

```
Hello world
HELLO WORLD
hello world
| Hello World
|lots of space|
Hello Class
```

There are also lost of ways to inspect or check strings. Examples of a few of these are given here:

6.4 String comparison operations

Strings can be compared in lexicographical order with the usual comparisons. In addition the in operator checks for substrings:

```
In [29]: 'abc' < 'bbc' <= 'bbc'
Out[29]: True
In [30]: "ABC" in "This is the ABC of Python"
Out[30]: True</pre>
```

6.5 Accessing parts of strings

Strings can be indexed with square brackets. Indexing starts from zero in Python.

Finally a substring (range of characters) an be specified as using a:b to specify the characters at index $a, a+1, \ldots, b-1$. Note that the last character is not included.

```
First three charcters 123
Next three characters 456
```

An empty beginning and end of the range denotes the beginning/end of the string:

6.6 Strings are immutable

It is important that strings are constant, immutable values in Python. While new strings can easily be created it is not possible to modify a string:

In []:

All of these python notebooks are available at [https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git]

7 Data Structures

In simple terms, It is the the collection or group of data in a particular structure.

7.1 Lists

Lists are the most commonly used data structure. Think of it as a sequence of data that is enclosed in square brackets and data are separated by a comma. Each of these data can be accessed by calling it's index value. Lists are declared by just equating a variable to '[]' or list.

```
In [81]: a = []
```

```
In [82]: type(a)
Out[82]: list
```

One can directly assign the sequence of data to a list x as shown.

```
In [83]: x = ['apple', 'orange']
```

7.1.1 Indexing

In python, indexing starts from 0 as already seen for strings. Thus now the list x, which has two elements will have apple at 0 index and orange at 1 index.

```
In [84]: x[0]
Out[84]: 'apple'
```

Indexing can also be done in reverse order. That is the last element can be accessed first. Here, indexing starts from -1. Thus index value -1 will be orange and index -2 will be apple.

```
In [85]: x[-1]
Out[85]: 'orange'
```

As you might have already guessed, x[0] = x[-2], x[1] = x[-1]. This concept can be extended towards lists with more many elements.

```
In [86]: y = ['carrot', 'potato']
```

Here we have declared two lists x and y each containing its own data. Now, these two lists can again be put into another list say z which will have it's data as two lists. This list inside a list is called as nested lists and is how an array would be declared which we will see later.

Indexing in nested lists can be quite confusing if you do not understand how indexing works in python. So let us break it down and then arrive at a conclusion.

Let us access the data 'apple' in the above nested list. First, at index 0 there is a list ['apple', 'orange'] and at index 1 there is another list ['carrot', 'potato']. Hence z[0] should give us the first list which contains 'apple' and 'orange'. From this list we can take the second element (index 1) to get 'orange'

```
In [88]: print(z[0][1])
```

orange

Lists do not have to be homogenous. Each element can be of a different type:

```
In [89]: ["this is a valid list",2,3.6,(1+2j),["a","sublist"]]
Out[89]: ['this is a valid list', 2, 3.6, (1+2j), ['a', 'sublist']]
```

7.1.2 Slicing

Indexing was only limited to accessing a single element, Slicing on the other hand is accessing a sequence of data inside the list. In other words "slicing" the list.

Slicing is done by defining the index values of the first element and the last element from the parent list that is required in the sliced list. It is written as parentlist[a:b] where a,b are the index values from the parent list. If a or b is not defined then the index value is considered to be the first value for a if a is not defined and the last value for b when b is not defined.

You can also slice a parent list with a fixed length or step length.

```
In [91]: num[:9:3]
Out[91]: [0, 3, 6]
```

7.1.3 Built in List Functions

To find the length of the list or the number of elements in a list, len() is used.

```
In [92]: len(num)
Out[92]: 10
```

If the list consists of all integer elements then **min()** and **max()** gives the minimum and maximum value in the list. Similarly **sum** is the sum

```
In [93]: print("min =",min(num)," max =",max(num)," total =",sum(num))
min = 0 max = 9 total = 45
In [94]: max(num)
Out[94]: 9
```

Lists can be concatenated by adding, '+' them. The resultant list will contain all the elements of the lists that were added. The resultant list will not be a nested list.

```
In [95]: [1,2,3] + [5,4,7]
Out[95]: [1, 2, 3, 5, 4, 7]
```

There might arise a requirement where you might need to check if a particular element is there in a predefined list. Consider the below list.

```
In [96]: names = ['Earth', 'Air', 'Fire', 'Water']
```

To check if 'Fire' and 'Rajath' is present in the list names. A conventional approach would be to use a for loop and iterate over the list and use the if condition. But in python you can use 'a in b' concept which would return 'True' if a is present in b and 'False' if not.

```
In [97]: 'Fire' in names
```

```
Out[97]: True
In [98]: 'Space' in names
Out[98]: False
```

In a list with string elements, **max()** and **min()** are still applicable and return the first/last element in lexicographical order.

Here the first index of each element is considered and thus z has the highest ASCII value thus it is returned and minimum ASCII is a. But what if numbers are declared as strings?

Even if the numbers are declared in a string the first index of each element is considered and the maximum and minimum values are returned accordingly.

But if you want to find the max() string element based on the length of the string then another parameter key can be used to specify the function to use for generating the value on which to sort. Hence finding the longest and shortest string in mlist can be doen using the len function:

Any other built-in or user defined function can be used.

A string can be converted into a list by using the **list()** function, or more usefully using the **split()** method, which breaks strings up based on spaces.

Appending a list to a list would create a sublist. If a nested list is not what is desired then the **extend(**) function can be used.

```
[1, 1, 4, 8, 7, 1, 10, 11, 12]
```

count() is used to count the number of a particular element that is present in the list.

```
In [105]: lst.count(1)
Out[105]: 3
```

index() is used to find the index value of a particular element. Note that if there are multiple elements of the same value then the first index value of that element is returned.

```
In [106]: lst.index(1)
Out[106]: 0
```

insert(x,y) is used to insert a element y at a specified index value x. append() function made it only possible to insert at the end.

insert(x,y) inserts but does not replace element. If you want to replace the element with another element you simply assign the value to that particular index.

pop() function return the last element in the list. This is similar to the operation of a stack. Hence it wouldn't be wrong to tell that lists can be used as a stack.

```
In [109]: lst.pop()
Out[109]: 12
```

Index value can be specified to pop a ceratin element corresponding to that index value.

```
In [110]: lst.pop(0)
Out[110]: 1
```

pop() is used to remove element based on it's index value which can be assigned to a variable. One can also remove element by specifying the element itself using the **remove()** function.

Alternative to **remove** function but with using index value is **del**

The entire elements present in the list can be reversed by using the **reverse()** function.

Note that the nested list [5,4,2,8] is treated as a single element of the parent list lst. Thus the elements inside the nested list is not reversed.

Python offers built in operation **sort()** to arrange the elements in ascending order. Alternatively **sorted()** can be used to construct a copy of the list in sorted order

For descending order, By default the reverse condition will be False for reverse. Hence changing it to True would arrange the elements in descending order.

Similarly for lists containing string elements, **sort()** would sort the elements based on it's ASCII value in ascending and by specifying reverse=True in descending.

To sort based on length key=len should be specified as shown.

7.1.4 Copying a list

Assignment of a list does not imply copying. It simply creates a second reference to the same list. Most of new python programmers get caught out by this initially. Consider the following,

Here, We have declared a list, lista = [2,1,4,3]. This list is copied to list by assigning it's value and it get's copied as seen. Now we perform some random operations on lista.

listb has also changed though no operation has been performed on it. This is because you have assigned the same memory space of lista to listb. So how do fix this?

If you recall, in slicing we had seen that parentlist[a:b] returns a list from parent list with start index a and end index b and if a and b is not mentioned then by default it considers the first and last element. We use the same concept here. By doing so, we are assigning the data of lists to list b as a variable.

```
In [121]: lista = [2,1,4,3]
          listb = lista[:] # make a copy by taking a slice from beginning to end
          print("Starting with:")
          print("A =",lista)
          print("B =",listb)
          lista.sort()
          lista.pop()
          lista.append(9)
          print("Finnished with:")
          print("A =",lista)
          print("B =",listb)
Starting with:
A = [2, 1, 4, 3]
B = [2, 1, 4, 3]
Finnished with:
A = [1, 2, 3, 9]
B = [2, 1, 4, 3]
```

7.2 List comprehension

A very powerful concept in Python (that also applies to Tuples, sets and dictionaries as we will see below), is the ability to define lists using list comprehension (looping) expression. For example:

```
In [122]: [i**2 for i in [1,2,3]]
Out[122]: [1, 4, 9]
```

As can be seen this constructs a new list by taking each element of the original [1,2,3] and squaring it. We can have multiple such implied loops to get for example:

```
In [123]: [10*i+j for i in [1,2,3] for j in [5,7]]
Out[123]: [15, 17, 25, 27, 35, 37]
```

Finally the looping can be filtered using an if expression with the for - in construct.

```
In [124]: [10*i+j for i in [1,2,3] if i%2==1 for j in [4,5,7] if j >= i+4] # keep odd i and j larger to Out[124]: [15, 17, 37]
```

7.3 Tuples

Tuples are similar to lists but only big difference is the elements inside a list can be changed but in tuple it cannot be changed. Think of tuples as something which has to be True for a particular something and cannot be True for no other values. For better understanding, Recall **divmod()** function.

Here the quotient has to be 3 and the remainder has to be 1. These values cannot be changed whatsoever when 10 is divided by 3. Hence divmod returns these values in a tuple.

To define a tuple, A variable is assigned to paranthesis () or tuple().

```
In [126]: tup = ()
     tup2 = tuple()
```

If you want to directly declare a tuple it can be done by using a comma at the end of the data.

```
In [127]: 27,
Out[127]: (27,)
```

27 when multiplied by 2 yields 54, But when multiplied with a tuple the data is repeated twice.

```
In [128]: 2*(27,)
Out[128]: (27, 27)
```

Values can be assigned while declaring a tuple. It takes a list as input and converts it into a tuple or it takes a string and converts it into a tuple.

It follows the same indexing and slicing as Lists.

7.3.1 Mapping one tuple to another

Tupples can be used as the left hand side of assignments and are matched to the correct right hand side elements - assuming they have the right length

More complex nexted unpackings of values are also possible

7.3.2 Built In Tuple functions

count() function counts the number of specified element that is present in the tuple.

index() function returns the index of the specified element. If the elements are more than one then the index of the first element of that specified element is returned

```
In [135]: d.index('a')
Out[135]: 0
```

7.4 Sets

Sets are mainly used to eliminate repeated numbers in a sequence/list. It is also used to perform some standard set operations.

Sets are declared as set() which will initialize a empty set. Also set([sequence]) can be executed to declare a set with elements

```
\{1, 2, 3, 4\}
   elements 2,3 which are repeated twice are seen only once. Thus in a set each element is distinct.
   However be warned that {} is NOT a set, but a dictionary (see next chapter of this tutorial)
In [138]: type({})
Out[138]: dict
7.4.1 Built-in Functions
In [139]: set1 = set([1,2,3])
In [140]: set2 = set([2,3,4,5])
   union() function returns a set which contains all the elements of both the sets without repition.
In [141]: set1.union(set2)
Out[141]: {1, 2, 3, 4, 5}
   add() will add a particular element into the set. Note that the index of the newly added element is
arbitrary and can be placed anywhere not necessarily in the end.
In [142]: set1.add(0)
           set1
Out[142]: {0, 1, 2, 3}
   intersection() function outputs a set which contains all the elements that are in both sets.
In [143]: set1.intersection(set2)
Out[143]: {2, 3}
   difference() function out uts a set which contains elements that are in set1 and not in set2.
In [144]: set1.difference(set2)
Out[144]: {0, 1}
   symmetric_difference() function ouputs a function which contains elements that are in one of the
sets.
In [145]: set2.symmetric_difference(set1)
Out[145]: {0, 1, 4, 5}
   issubset(), isdisjoint(), issuperset() is used to check if the set1/set2 is a subset, disjoint or superset
of set2/set1 respectively.
In [146]: set1.issubset(set2)
Out[146]: False
In [147]: set2.isdisjoint(set1)
Out[147]: False
In [148]: set2.issuperset(set1)
```

```
Out[148]: False
  pop() is used to remove an arbitrary element in the set
In [150]: set1.pop()
          print(set1)
\{1, 2, 3\}
  remove() function deletes the specified element from the set.
In [151]: set1.remove(2)
          set1
Out[151]: {1, 3}
  clear() is used to clear all the elements and make that set an empty set.
In [152]: set1.clear()
           set1
Out[152]: set()
  All of these python notebooks are available at [https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git]
7.5
      Strings
Strings have already been discussed in Chapter 02, but can also be treated as collections similar to lists and
tuples. For example
In [1]:
In [4]: S = 'Taj Mahal is beautiful'
        print([x for x in S if x.islower()]) # list of lower case charactes
        words=S.split() # list of words
        print("Words are:",words)
        print("--".join(words)) # hyphenated
        " ".join(w.capitalize() for w in words) # capitalise words
['a', 'j', 'a', 'h', 'a', 'l', 'i', 's', 'b', 'e', 'a', 'u', 't', 'i', 'f', 'u', 'l']
Words are: ['Taj', 'Mahal', 'is', 'beautiful']
Taj--Mahal--is--beautiful
Out[4]: 'Taj Mahal Is Beautiful'
  String Indexing and Slicing are similar to Lists which was explained in detail earlier.
In [3]: print(S[4])
        print(S[4:])
```

Mahal is beautiful

7.6 Dictionaries

Dictionaries are mappings between keys and items stored in the dictionaries. Alternatively one can think of dictionaries as sets in which something stored against every element of the set. They can be defined as follows:

To define a dictionary, equate a variable to { } or dict()

As can be guessed from the output above. Dictionaries can be defined by using the { key : value } syntax. The following dictionary has three elements

```
In [6]: d = { 1: 'One', 2 : 'Two', 100 : 'Hundred'}
     len(d)
Out[6]: 3
```

Now you are able to access 'One' by the index value set at 1

```
In [32]: print(d[1])
1
```

There are a number of alternative ways for specifying a dictionary including as a list of (key,value) tuples. To illustrate this we will start with two lists and form a set of tuples from them using the zip() function Two lists which are related can be merged to form a dictionary.

Now we can create a dictionary that maps the name to the number as follows.

Note that the ordering for this dictionary is not based on the order in which elements are added but on its own ordering (based on hash index ordering). It is best never to assume an ordering when iterating over elements of a dictionary.

By using tuples as indexes we make a dictionary behave like a sparse matrix:

7.6.1 Built-in Functions

The len() function and in operator have the obvious meaning:

values () function returns a list with all the assigned values in the dictionary. (Acutally not quit a list, but something that we can iterate over just like a list to construct a list, tuple or any other collection):

```
In [23]: [ v for v in a1.values() ]
Out[23]: [3, 4, 5, 1, 2]
```

keys() function returns all the index or the keys to which contains the values that it was assigned to.

```
In [24]: { k for k in a1.keys() }
Out[24]: {'Five', 'Four', 'One', 'Three', 'Two'}
```

items() is returns a list containing both the list but each element in the dictionary is inside a tuple. This is same as the result that was obtained when zip function was used - except that the ordering has been 'shuffled' by the dictionary.

```
In [26]: ", ".join( "%s = %d" % (name,val) for name,val in a1.items())
Out[26]: 'Three = 3, Four = 4, Five = 5, One = 1, Two = 2'
```

pop() function is used to get the remove that particular element and this removed element can be assigned to a new variable. But remember only the value is stored and not the key. Because the is just a index value.

All of these python notebooks are available at [https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git]

8 Control Flow Statements

The key thing to note about Python's control flow statements and program structure is that it uses <u>indentation</u> to mark blocks. Hence the amount of white space (space or tab characters) at the start of a line is very important. This generally helps to make code more readable but can catch out new users of python.

8.1 Conditionals

```
8.1.1 If
```

```
python if some_condition:
                                code block
In [16]: x = 12
         if x > 10:
             print("Hello")
Hello
8.1.2 If-else
python if some_condition:
                                algorithm else:
                                                      algorithm
In [17]: x = 12
         if 10 < x < 11:
              print("hello")
              print("world")
world
8.1.3 Else if
python if some_condition:
                                  algorithm elif some_condition:
                                                                        algorithm else:
{\tt algorithm}
In [18]: x = 10
         y = 12
         if x > y:
             print("x>y")
         elif x < y:
              print("x<y")</pre>
         else:
              print("x=y")
x<y
   if statement inside a if statement or if-elif or if-else are called as nested if statements.
In [19]: x = 10
         y = 12
         if x > y:
             print( "x>y")
         elif x < y:
              print( "x<y")</pre>
              if x==10:
                  print ("x=10")
              else:
                  print ("invalid")
         else:
              print ("x=y")
x<y
x = 10
```

8.2 Loops

8.2.1 For

45

In the above example, i iterates over the 0,1,2,3,4. Every time it takes each value and executes the algorithm inside the loop. It is also possible to iterate over a nested list illustrated below.

A use case of a nested for loop in this case would be,

There are many helper functions that make **for** loops even more powerful and easy to use. For example **enumerate()**, **zip()**, **sorted()**, **reversed()**

```
reversed: c;b;a;
enuemerated:
0 = a; 1 = b; 2 = c;
zip'ed:
a : x
b : y
c : z
8.2.2 While
python while some_condition:
                                    algorithm
In [24]: i = 1
         while i < 3:
             print(i ** 2)
             i = i+1
         print('Bye')
1
Bye
```

8.2.3 Break

As the name says. It is used to break out of a loop when a condition becomes true when executing the loop.

8.2.4 Continue

This continues the rest of the loop. Sometimes when a condition is satisfied there are chances of the loop getting terminated. This can be avoided using continue statement.

```
Processed 4
Ignored 5
Ignored 6
Ignored 7
Ignored 8
Ignored 9
```

8.3 Catching exceptions

To break out of deeply nested execution sometimes it is useful to raise an exception. A try block allows you to catch exceptions that happen anywhere during the execution of the try block: python try: code except <Exception Type> as <variable name>: # deal with error of this type except: # deal with any error

```
In [27]: try:
             count=0
             while True:
                 while True:
                      while True:
                          print("Looping")
                          count = count + 1
                          if count > 3:
                              raise Exception("abort") # exit every loop or function
         except Exception as e: # this is where we go when an exception is raised
             print("Caught exception:",e)
Looping
Looping
Looping
Looping
Caught exception: abort
   This can also be useful to handle unexpected system errors more gracefully:
In [28]: try:
             for i in [2,1.5,0.0,3]:
                 inverse = 1.0/i
         except: # no matter what exception
             print("Cannot calculate inverse")
```

All of these python notebooks are available at [https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git]

9 Functions

Cannot calculate inverse

Functions can represent mathematical functions. More importantly, in programmming functions are a mechansim to allow code to be re-used so that complex programs can be built up out of simpler parts.

This is the basic syntax of a function

Read the above syntax as, A function by name "funcame" is defined, which accepts arguments "arg1,arg2,....argN". The function is documented and it is "Document String". The function after executing the statements returns a "value".

Return values are optional (by default every function returns None if no return statement is executed)

Instead of writing the above two statements every single time it can be replaced by defining a function which would do the job in just one line.

Defining a function firstfunc().

firstfunc() every time just prints the message to a single person. We can make our function firstfunc() to accept arguments which will store the name and then prints respective to that accepted name. To do so, add a argument within the function as shown.

So we pass this variable to the function **firstfunc()** as the variable username because that is the variable that is defined for this function. i.e name1 is passed as username.

```
In [5]: firstfunc(name1)
Hello sally.
sally, how are you?
```

9.1 Return Statement

When the function results in some value and that value has to be stored in a variable or needs to be sent back or returned for further operation to the main algorithm, a return statement is used.

```
In [6]: def times(x,y):
    z = x*y
    return z
```

The above defined **times()** function accepts two arguements and return the variable z which contains the result of the product of the two arguements

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The z value is stored in variable c and can be used for further operations.

Instead of declaring another variable the entire statement itself can be used in the return statement as shown.

Since the **times()** is now defined, we can document it as shown above. This document is returned whenever **times()** function is called under **help()** function.

```
In [10]: help(times)
Help on function times in module __main__:
times(x, y)
    This multiplies the two input arguments
```

Multiple variable can also be returned as a tuple. However this tends not to be very readable when returning many value, and can easily introduce errors when the order of return values is interpreted incorrectly.

If the function is just called without any variable for it to be assigned to, the result is returned inside a tuple. But if the variables are mentioned then the result is assigned to the variable in a particular order which is declared in the return statement.

9.2 Default arguments

When an argument of a function is common in majority of the cases this can be specified with a default value. This is also called an implicit argument.

implicitadd() is a function accepts up to three arguments but most of the times the first argument needs to be added just by 3. Hence the second argument is assigned the value 3 and the third argument is zero. Here the last two arguments are default arguments.

Now if the second argument is not defined when calling the **implicitadd()** function then it considered as 3.

```
In [19]: implicitadd(4)
4 + 3 + 0 = 7
Out[19]: 7
```

However we can call the same function with two or three arguments. A useful feature is to explicitly name the argument values being passed into the function. This gives great flexibility in how to call a function with optional arguments. All off the following are valid:

9.3 Any number of arguments

If the number of arguments that is to be accepted by a function is not known then a asterisk symbol is used before the name of the argument to hold the remainder of the arguments. The following function requires at least one argument but can have many more.

The above function defines a list of all of the arguments, prints the list and returns the sum of all of the arguments.

```
In [22]: add_n(1,2,3,4,5)
[1, 2, 3, 4, 5]
Out[22]: 15
In [23]: add_n(6.5)
[6.5]
Out[23]: 6.5
```

Arbitrary numbers of named arguments can also be accepted using **. When the function is called all of the additional named arguments are provided in a dictionary

9.4 Global and Local Variables

Whatever variable is declared inside a function is local variable and outside the function in global variable.

```
In [29]: eg1 = [1,2,3,4,5]
Out[29]: 33
```

In the below function we are appending a element to the declared list inside the function. eg2 variable declared inside the function is a local variable.

If a **global** variable is defined as shown in the example below then that variable can be called from anywhere. Global values should be used sparingly as they make functions harder to re-use.

9.5 Lambda Functions

These are small functions which are not defined with any name and carry a single expression whose result is returned. Lambda functions comes very handy when operating with lists. These function are defined by the keyword lambda followed by the variables, a colon and the respective expression.

```
In []: z = lambda x: x * x
In []: z(8)
```

9.5.1 Composing functions

Lambda functions can also be used to compose functions

All of these python notebooks are available at [https://gitlab.erc.monash.edu.au/andrease/Python4Maths.git]

10 Classes

Variables, Lists, Dictionaries etc in python are objects. Without getting into the theory part of Object Oriented Programming, explanation of the concepts will be done along this tutorial.

A class is declared as follows

pass in python means do nothing. The string defines the documentation of the class, accessible via help(FirstClass)

Above, a class object named "FirstClass" is declared now consider a "egclass" which has all the characteristics of "FirstClass". So all you have to do is, equate the "egclass" to "FirstClass". In python jargon this is called as creating an instance. "egclass" is the instance of "FirstClass"

```
In [4]: egclass = FirstClass()
In [5]: type(egclass)
Out[5]: __main__.FirstClass
In [6]: type(FirstClass)
Out[6]: type
```

Objects (instances of a class) can hold data. A variable in an object is also called a field or an attribute. To access a field use the notation object.field. For example:x

```
In [7]: obj1 = FirstClass()
    obj2 = FirstClass()
    obj1.x = 5
    obj2.x = 6
    x = 7
    print("x in object 1 =",obj1.x,"x in object 2=",obj2.x,"global x =",x)
```

```
x in object 1 = 5 x in object 2= 6 global x = 7
```

Now let us add some "functionality" to the class. A function inside a class is called as a "Method" of that class

Note that the reset() and function and the getCount() method are callled with one less argument than they are declared with. The self argument is set by Python to the calling object. Here counter.reset(0) is equivalent to Counter.reset(counter,0). Using self as the name of the first argument of a method is simply a common convention. Python allows any name to be used.

Note that here it would be better if we could initialise Counter objects immediately with a default value of count rather than having to call reset(). A constructor method is declared in Python with the special name __init__:

Now that we have defined a function and added the __init__ method. We can create a instance of FirstClass which now accepts two arguments.

dir() function comes very handy in looking into what the class contains and what all method it offers

```
Contents of Counter class: ['__class__', '__delattr__', '__dict__', '__dir__', '__doc__', '__eq__', '__format__
Contents of counter object: ['__class__', '__delattr__', '__dict__', '__dir__', '__doc__', '__eq__', '__format_
```

dir() of an instance also shows it's defined attributes so the object has the additional 'count' attribute. Note that Python defines several default methods for actions like comparison ($__le_-$ is \le operator). These and other special methods can be defined for classes to implement specific meanings for how object of that class should be compared, added, multiplied or the like.

Changing the FirstClass function a bit,

Just like global and local variables as we saw earlier, even classes have it's own types of variables.

Class Attribute: attributes defined outside the method and is applicable to all the instances.

Instance Attribute: attributes defined inside a method and is applicable to only that method and is unique to each instance.

```
In [18]: class FirstClass:
    test = 'test'
    def __init__(self,n,s):
        self.name = n
        self.symbol = s
```

Here test is a class attribute and name is a instance attribute.

```
In [22]: eg3 = FirstClass('Three',3)
In [24]: print(eg3.test,eg3.name,eg3.symbol)
TEST Three 3
```

10.1 Inheritance

There might be cases where a new class would have all the previous characteristics of an already defined class. So the new class can "inherit" the previous class and add it's own methods to it. This is called as inheritance.

Consider class Software Engineer which has a method salary.

Now consider another class Artist which tells us about the amount of money an artist earns and his artform.

```
Nitin earns 50000
Nitin is a Musician
In [38]: [ name for name in dir(b) if not name.startswith("_")]
Out[38]: ['age', 'artform', 'job', 'money', 'name']
   money method and salary method are the same. So we can generalize the method to salary and inherit
the Software Engineer class to Artist class. Now the artist class becomes,
In [37]: class Artist(SoftwareEngineer):
             def artform(self, job):
                  self.job = job
                  print self.name,"is a", self.job
In [38]: c = Artist('Nishanth',21)
In [39]: dir(Artist)
Out[39]: ['__doc__', '__init__', '__module__', 'artform', 'salary']
In [40]: c.salary(60000)
         c.artform('Dancer')
Nishanth earns 60000
Nishanth is a Dancer
   Suppose say while inheriting a particular method is not suitable for the new class. One can override this
method by defining again that method with the same name inside the new class.
In [39]: class Artist(SoftwareEngineer):
             def artform(self, job):
                  self.job = job
                  print(self.name, "is a", self.job)
             def salary(self, value):
                  self.money = value
                  print(self.name, "earns", self.money)
                  print("I am overriding the SoftwareEngineer class's salary method")
In [40]: c = Artist('Nishanth',21)
In [41]: c.salary(60000)
         c.artform('Dancer')
Nishanth earns 60000
I am overriding the Software Engineer class's salary method
Nishanth is a Dancer
   If the number of input arguments varies from instance to instance asterisk can be used as shown.
In [42]: class NotSure:
             def __init__(self, *args):
                  self.data = ' '.join(list(args))
In [43]: yz = NotSure('I', 'Do', 'Not', 'Know', 'What', 'To', 'Type')
In [44]: yz.data
```

Out[44]: 'I Do Not Know What To Type'

10.2 Introspection

We have already seen the dir() function for working out what is in a class. Python has many facilities to make introspection easy (that is working out what is in a Python object or module). Some useful functions are hasattr, getattr, and setattr:

10.3 Scientific Python

10.3.1 Matrices

Dealing with vectors and matrices efficiently requires the **numpy** library. For the sake of brevity we will import this with a shorter name:

```
In [2]: import numpy as np
```

The numpy supports arrays and matrices with many of the features that would be familiar to matlab users. See here quick summary of numpy for matlab users.

Appart from the convenience, the numpy methods are also much faster at performing operations on matrices or arrays than performing arithmetic with numbers stored in lists.

However watch out: array is not quite a matrix. For proper matrix operations you need to use the matrix type. Unlike **array**s that can have any number of dimensions, matrices are limited to 2 dimension. However matrix multiplication does what you would expect from a linear algebra point of view, rather than an element-wise multiplication:

Much more information on how to use numpy is available at quick start tutorial

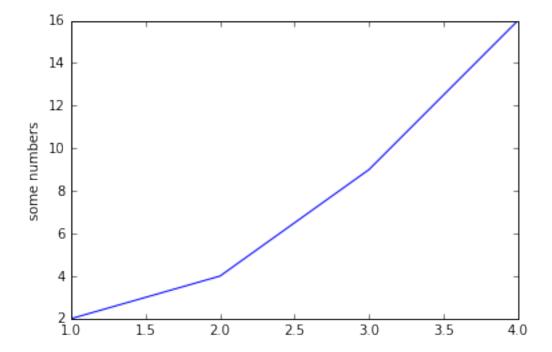
10.3.2 Plotting

There are lots of configuration options for the **matplotlib** library that we are using here. For more information see [http://matplotlib.org/users/beginner.html]

To get started we need the following bit of 'magic' to make the plotting work:

```
In [2]: %matplotlib inline
    import numpy as np
    import matplotlib.pyplot as plt
```

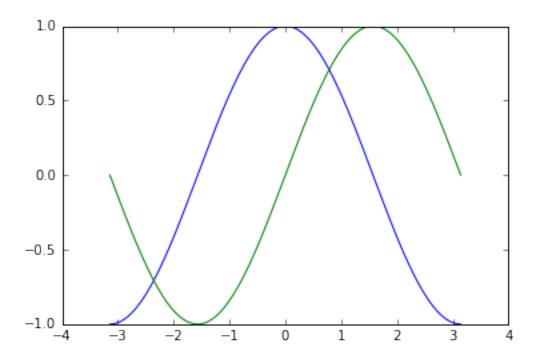
Now we can try something simple:



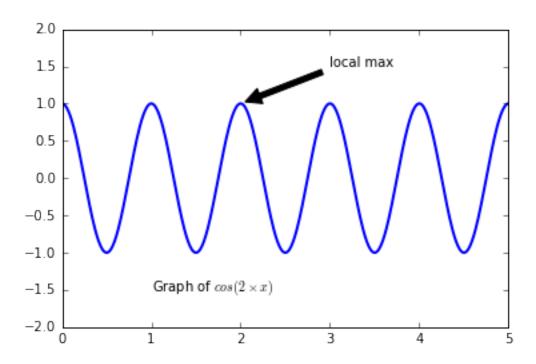
```
In [7]: # A slightly more complicated plot with the help of numpy
    X = np.linspace(-np.pi, np.pi, 256, endpoint=True)
    C, S = np.cos(X), np.sin(X)

plt.plot(X, C)
    plt.plot(X, S)

plt.show()
```



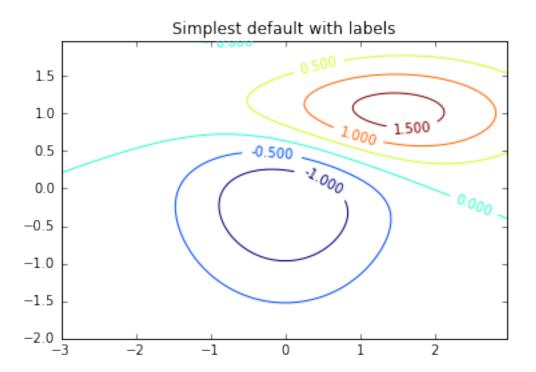
Annotating plots can be done with methods like **text()** to place a label and **annotate()**. For example:



Here is an example of how to create a basic surface contour plot.

In [7]: import matplotlib.mlab as mlab # for bivariate_normal to define our surface

```
delta = 0.025
x = np.arange(-3.0, 3.0, delta)
y = np.arange(-2.0, 2.0, delta)
X, Y = np.meshgrid(x, y) # define mesh of points
Z1 = mlab.bivariate\_normal(X, Y, 1.0, 1.0, 0.0, 0.0)
Z2 = mlab.bivariate_normal(X, Y, 1.5, 0.5, 1, 1)
Z = 10.0 * (Z2 - Z1) # difference of Gaussians
# Create a simple contour plot with labels using default colors. The
# inline argument to clabel will control whether the labels are draw
# over the line segments of the contour, removing the lines beneath
# the label
plt.figure()
CS = plt.contour(X, Y, Z)
plt.clabel(CS, inline=1, fontsize=10)
plt.title('Simplest default with labels')
plt.show()
```



In []:

11 Integer & Linear Programming

11.1 An example

Setting up data: cost matrix, demand, supply

Total demand = 68

Now we can define a linear program

$$\min \sum_{i \in F} \sum_{j \in R} c_{ij} x_{ij}$$

Subject To

$$\sum_{r \in R} x_{fr} \le s_r \quad \forall f \in F$$

$$\sum_{f \in F} x_{fr} = d_f \quad \forall r \in R$$

$$x \ge 0$$

```
In [2]: from mymip.mycplex import Model
        lp = Model()
        # define double indexed variables and give them a meaningful names
        x = [[lp.variable('x\%dto\%d'\%(i,j)) for j in R]]
             for i in F ]
        lp.min( sum( C[i][j] * x[i][j] for i in F for j in R))
        # constraints can be given names too:
        lp.SubjectTo({"Supply%d"%f: sum(x[f][r] for r in R) <= supply[f]</pre>
        lp.SubjectTo(("Demand%02d"%r, sum(x[f][r] for f in F) == demand[r] ) for r in R)
        for f in F:
            for r in R: x[f][r] >= 0 # all variables non-negative
        lp.param["SCRIND"]=1 # set parameter to show CPLEX output
        lp.optimise()
        print("The minimum cost is",lp.objective())
        for r in R:
            for f in F:
                if x[f][r].x > 0: # amount is not zero
                    print("%.1f from F%d to R%02d"%(x[f][r].x,f,r))
Tried aggregator 1 time.
LP Presolve eliminated 0 rows and 4 columns.
Aggregator did 12 substitutions.
Reduced LP has 2 rows, 8 columns, and 16 nonzeros.
Presolve time = 0.09 sec. (0.02 \text{ ticks})
Iteration log . . .
Iteration:
               1 Dual objective
                                                  122.000000
The minimum cost is 122.0
9.0 from F0 to R00
4.0 from F0 to R01
2.0 from F0 to R02
6.0 from FO to RO3
4.0 from F1 to R04
5.0 from F1 to R05
7.0 from F1 to R06
8.0 from F1 to R07
3.0 from F1 to R08
6.0 from F1 to R09
8.0 from FO to R10
1.0 from F1 to R10
5.0 from F0 to R11
  To see how the solve sees this problem, try writing it out to file and printing the contents of the file:
In [3]: lp.write("myfirst.lp")
        print(open("myfirst.lp", "r").read())
\ENCODING=ISO-8859-1
\Problem name: Model
Minimize
 obj: x0to0 + 2 x0to1 + 2 x0to2 + x0to3 + 3 x0to4 + 4 x0to5 + 5 x0to6 + 7 x0to7
```

```
+ 5 \times 0 \times 100 + 2 \times 0 \times 100 + 3 \times 0 \times 100 + 2 \times 1000 + 4 \times 1000 + 5 \times 1000 
                             + 4 x1to3 + x1to4 + 3 x1to5 + x1to6 + 2 x1to7 + x1to8 + 2 x1to9
                             + 4 x1to10 + 6 x1to11
Subject To
    Supply0: x0to0 + x0to1 + x0to2 + x0to3 + x0to4 + x0to5 + x0to6 + x0to7
                                                      + x0to8 + x0to9 + x0to10 + x0to11 <= 34
    Supply1: x1to0 + x1to1 + x1to2 + x1to3 + x1to4 + x1to5 + x1to6 + x1to7
                                                      + x1to8 + x1to9 + x1to10 + x1to11 <= 45
    Demand00: x0to0 + x1to0 = 9
    Demand01: x0to1 + x1to1 = 4
    Demand02: x0to2 + x1to2 = 2
    Demand03: x0to3 + x1to3 = 6
    Demand04: x0to4 + x1to4 = 4
    Demand05: x0to5 + x1to5 = 5
    Demand06: x0to6 + x1to6 = 7
    Demand07: x0to7 + x1to7 = 8
    Demand08: x0to8 + x1to8 = 3
    Demand09: x0to9 + x1to9 = 6
    Demand10: x0to10 + x1to10 = 9
    Demand11: x0to11 + x1to11 = 5
End
```

In []: