LESSON 01 - Building Programs With Python

These notes are a guide to the speaker, as they present the material.

Before you start

• Test your Jupyter installation and make sure you can connect to the kernel.

Slides

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SLIDE Building Programs With Python (1)

SLIDE INTRODUCTION

SLIDE WHY ARE WE HERE?

- We're here to learn how to program
- This is a way to solve problems in your research through making a computer do work quickly and accurately
- You'll build functions that do specific, defined tasks
- You'll automate those functions to perform tasks over and over again (in various combinations)
- You'll manipulate data, which is at the heart of all academia
- · You'll learn some file input/output to make the computer read and write useful information
- You'll learn some **Data structures**, which are ways to organise data so that the computer can deal with it efficiently

SLIDE XKCD

- This cartoon is a *little* flippant, but only a bit
- The principles of a programming language like Perl are universal
- Many concepts are universal across programming languages
- Learning one programming language will speed up the process of learning others
- Q: HOW MANY PEOPLE HERE HAVE EXPERIENCE OF AT LEAST ONE PROGRAMMING LANGUAGE?

• What the more experienced here encounter should be recognisable to them

SLIDE HOW ARE WE DOING THIS?

- We'll be learning how to program using Python
- Why Python?
- We need to use *some* language
- Python is free, with good documentation and lots of books and online courses.
- Python is widely-used in academia, and there's lots of support online
- It can be easier for novices to pick up than other languages
- We won't be covering the entire language in detail
- We will be using some long-handed ways of doing things to keep them clear for novices

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SLIDE NO, I MEAN "HOW ARE WE DOING THIS?"

- We'll use two tools to write Python
- The bulk of the course will be in the Jupyter notebook
- Jupyter is good for exploring data, prototyping code, data-wrangling, and teaching
- · However, it's not so good for writing "production code" in a general sense
- So, we'll also spend a little bit of time writing code in a text editor
- Text editors are part of the edit-save-execute cycle, which is how much code is written
- There are also specialist **integrated development environments (IDEs)** for Python that are extremely useful for developers, but we'll not be using them

SLIDE DO I NEED TO USE PYTHON AFTERWARDS?

- No.
- The lesson and principles are general, we're just teaching in Python
- · What you learn here will be relevant in other languages
- If your field or colleagues use another language in preference, there may be very good reasons for that, and they may be able to offer detailed, relevant support and help to you in that language. This is valuable.
- Language Wars waste everyone's time.

SLIDE WHAT ARE WE DOING?

- We're using a motivating example of data analysis
- We've got some data relating to a new treatment for arthritis, and we're going to explore it.
- Data represents patients and daily measurements of inflammation
- We're going to analyse the data
- We're going to visualise the data
- We're going to get the computer to do this for us
- Automation is key: fewer human mistakes, easier to apply to other future datasets, and share with

others (transparency)

 We can also share our code and results via sites such as GitHub and BitBucket (supplementary information, impact)

SLIDE SETUP

AT THIS POINT, PUT THE TERMINAL ON-SCREEN IN A SINGLE PROJECTOR SETUP, AND MOVE THE SLIDES TO THE DESKTOP

SLIDE SETTING UP - 1 - DEMO

• We want a **neat (clean) working environment**: always a good idea when starting a new project - it helps for when you might want to use git to put it under version control, later.

- Change directory to desktop (in terminal or Explorer)
- **Create directory** python-novice-inflammation
- Change your working directory to that directory

cd ~/Desktop
mkdir python-novice-inflammation

cd python-novice-inflammation

SLIDE SETTING UP - 2 - DEMO

- We need to **download our data** (and also a little code that can help us)
- Go to Etherpad in browser http://pad.software-carpentry.org/2017-05-18-standrews
- Point out file links http://swcarpentry.github.io/python-novice-inflammation/data/python-novice-inflammation/d

- Click on file links to download
- Move files to python-novice-inflammation directory
- Extract files this will create a subdirectory called data in that folder
- CHECK WHETHER EVERYONE HAS EXTRACTED THE DATA

Red sticky for a question or issue

Green sticky if complete

SLIDE GETTING STARTED

SLIDE STARTING JUPYTER DEMO

• Make sure you're in the project directory python-novice-inflammation

- Start Jupyter from the command-line
- CHECK WHETHER EVERYONE SEES A WORKING JUPYTER NOTEBOOK



- Point out Python (.py) files, .zip files, and directories)
- Point out directory (data), and how the file symbols are different. (*the triangle by the check box gives a key*)

• Point out New button.

SLIDE CREATE A NEW NOTEBOOK DEMO

- Click on New -> Python 3
- Point out that there may or may not be other options in the student's installation
- Indicate the new features on the empty notebook:
 - The notebook name: Untitled
 - Checkpoint information (the last time the notebook was saved, for safety)
 - The menu bar (File Edit etc.) just like Word Or Excel
 - An indication of which kernel you're using/language you're in
 - Icon view (just like Word Or Excel)
 - An empty cell with In []:
- Point out the **box around the cell**, and that it **changes colour** when you start to edit

SLIDE MY FIRST NOTEBOOK DEMO

- Give the notebook the name variables
- Click on Untitled and enter the name variables

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SLIDE CELL TYPES DEMO

- Jupyter documents are comprised of cells
- A cell can be one of **several types** we'll focus on two:

- Code : code in the current kernel/language
- Markdown : text, with the opportunity for formatting
- Change the first cell type to Markdown
 - The box colour changes from green to blue
 - The In [] prompt disappears

SLIDE MARKDOWN TEXT DEMO

- Markdown lets us enter formatted text
 - Headers are preceded by a hash: #
 - The level of header is determined by the number of hashes: #
 - Typewriter text/code is shown by enclosing in backticks: ```
 - **Italics** are shown by enclosing text in single asterisks: *italic*
 - LaTeX can be entered within dollar signs \$
- Press Shift + Enter to execute a cell
- The cell is rendered, and a new cell appears beneath the executed cell

```
# Variables in Python
```

Python as a calculator

```
We can use `Python` as a calculator by typing mathematical statements into a code cell, and *executing* that cell by pressing `Shift + Enter`.
```

We will enter the statement 1 + 2 to see the result.

SLIDE ENTERING CODE DEMO

- Mathematical statements can be entered directly into a code cell
 - ENTER 1+2
- Before the cell is executed, note that the In [] prompt has no value in it
- Note that the code is colour syntax-highlighted
 - **EXECUTE THE CELL** Shift + Enter
- Note that after execution, the In [] prompt now has a number in it to indicate the order in which cells were executed
- Note also that because there is no place to put the output, a value has been returned as
 OUT [1], showing the result of the calculation

• A new code cell is created beneath the executed cell.



SLIDE EXERCISE 01

• PUT THE EXERCISE SLIDE ON SCREEN

Ask the learners to try some calculator calculations, and demo some of your own



Red sticky for a question or issue

Green sticky if complete

WHEN FINISHED, GO BACK TO THE NOTEBOOK AND PUT THE SLIDES ON THE DESKTOP

SLIDE MY FIRST VARIABLE

- TYPE THE MARKDOWN IN A CELL AND EXECUTE
 - This is to keep the notebook as an example of literate programming (and a handy reference for the students)



- Use a real-life example to hand if possible
- You can think of a variable as a labelled box, containing a data item
 - Here, we have a box labelled Name this is the variable name
 - We've put the value Samia into the box

SLIDE CREATING A VARIABLE

name = "Samia"

• LET'S DO THIS FOR REAL IN PYTHON - follow on from the physical example if possible

- To assign a value we use the equals sign
- The variable name/box label goes on the left, and the data item goes on the right
- Character strings, or strings, are enclosed in quotes
- · Executing the cell assigns the variable
- So now, if we refer to the variable Name, we get the value that's in the box: Samia



Green sticky if complete

SLIDE INSPECTING A VARIABLE

- The print() function shows contents of a variable
- We refer to the name of the variable, and get its contents

print(name) Red sticky for a question or issue Green sticky if complete

SLIDE WORKING WITH VARIABLES

- Lead the students through the code:
- · Note, we're assigning an integer now (no quotes), but assignment is the same for all data items
- Print weight_kg to see its value

```
weight_kg = 55
print(weight_kg)
```

Variables can be substituted by name wherever a value would go, in calculations for example

2.2 * weight_kg

· People may ask about floating point representations here - an introduction is at

https://docs.python.org/3/tutorial/floatingpoint.html - put this on the Etherpad.

• The print() function will take more than one argument, separated by commas, and print them

```
print("weight in pounds", 2.2 * weight_kg)
```

· Reassigning to the same variable overwrites the old value

```
weight_kg = 57.5
print("weight in kilograms is now:", weight_kg)
```

 Changing the value of one variable does not automatically change the values of other defined variables

```
print(weight_kg)
weight_lb = 2.2 * weight_kg
print('weight in kilograms:', weight_kg, 'and in pounds:', weight_lb)
weight_kg = 100
print('weight in kilograms:', weight_kg, 'and in pounds:', weight_lb)
```

Although we changed the value in weight_kg, weight_lb did not change when we did so

Red sticky for a question or issue

Green sticky if complete

SLIDE EXERCISE 02 (5MIN)

- PUT THE EXERCISE SLIDE ON SCREEN MCQ: put up four colours of sticky notes
- The solution is 2

SLIDE EXERCISE 03 (5MIN)

MCQ: put up four colours of sticky notes

• The code prints Hopper Grace

WHEN FINISHED, GO BACK TO THE NOTEBOOK AND PUT THE SLIDES ON THE DESKTOP

SLIDE DATA ANALYSIS

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SLIDE START A NEW NOTEBOOK

- Create a new notebook, and give it the name analysis
- For this, you can introduce File -> New Notebook -> Python 3 as a way to create a new notebook



• numpy is a library that provides functions and pethods to work with arrays and matrices, such as those in your dataset

SLIDE LOAD DATA

```
## Load data
Load comma-separated data from a file
• The numpy library gives us a function called loadtxt() that loads tabular data from a file
• To use a function from a library, the format is usually library.function() : *dotted
```

- notation*
- loadtxt() expects two arguments or *parameters* values it needs to know to work
- The parameter fname takes the path to the file we want to load
- The parameter delimiter takes the character that we think separates columns in that file

numpy.loadtxt(fname='data/inflammation-01.csv', delimiter=',')

- NOTE: This can be a good place to introduce tab-completion!
- Here, our function is numpy.loadtxt(), and Dotted notation tells us that loadtxt() belongs
 to numpy
- Python will accept double- or single-quotes around strings
- EXECUTE THE CELL

SLIDE LOADED DATA

- We didn't ask Python to do anything with the data, so it it just shows the data to us.
- The data display is truncated by default *ellipses* (...) show rows and columns that were excluded for space
- Significant digits are not shown
- NOTE that integers in the file have been converted to floating point numbers
- Ask the learners to assign the matrix to a variable called data : MAKE THIS CHANGE IN-PLACE

data = numpy.loadtxt(fname="data/inflammation-01.csv", delimiter=",")

• Now when we execute the cell **we see no output**, but data now contains the array, which we can see by **printing the variable**

print(data)

SLIDE WHAT IS OUR DATA? LIVE DEMO

• We've loaded some data, but what is it?

type(data)

• Python sees our data as a special type : numpy.ndarray

- From *dotted notation* we see that *ndarray* belongs to (was defined in) the *numpy* library
- Indarray stands for "n-dimensional array" so this is an n-dimensional array from the numpy library

```
SLIDE MEMBERS AND ATTRIBUTES
```

- Creating our data array created a lot of information, too
- We created information about the array called attributes
- This information belongs to data so is accessed in the same way as a module function, through *dotted notation*

print(data.dtype)
print(data.shape)

- print(data.dtype) tells us that the **data type for values in the array** is: 64-bit floating point numbers
- print(data.shape) tells us that there are 60 rows and 40 columns in the dataset

SLIDE INDEXING ARRAYS

• Take learners through making notes in the notebook: fence blocks

```
# Indexing arrays
```

Arrays are indexed by *row* and *column*, using *square bracket* notation:

• To get a single element from the array, index using square bracket notation - row first, then column

data[30, 20] # get entry at row 30, column 20 of the array

- Execute the cell
- In **Python** we index from zero, so the first element is data[0, 0]



SLIDE SLICING ARRAYS

Take learners through making notes in the notebook

```
## Slicing arrays
We select sections of an array by *slicing* it - defining the start and end points of the
The *slice* `0:4` means "start at index 0 and go up to, but not including, index 4"
```

- To get a section from the array, index using *square bracket* notation but specify start and end points, separated by a colon
- The slice 0:4 means start at index zero and go up to, but not including, index 4. So it takes elements 0, 1, 2, 3 (four elements)
- Do the two print() examples

```
print(data[0:4, 0:10])
print(data[5:10, 0:10])
print(data[2:4, 2:4])
```

Red sticky for a question or issue



Green sticky if complete

SLIDE MORE SLICES, PLEASE!

- If we don't specify a start for the slice, Python assumes the first element is meant (element zero)
- If we don't specify an end for the slice, Python assumes the last element is meant
- To get the top-right corner of the array, we can specify data[:3, 36:]
- Demo the code

```
small = data[:3, 36:]
print('small is:')
print(small)
```

• QUESTION: What does : on its own mean?

```
print(data[0:2, :])
```

SLIDE EXERCISE 04

- PUT THE EXERCISE SLIDE ON SCREEN MCQ: put up four colours of sticky notes
- The value is oxyg, number 1

WHEN FINISHED, GO BACK TO THE NOTEBOOK AND PUT THE SLIDES ON THE DESKTOP

SLIDE ARRAY OPERATIONS

Array operations

Arithmetic operations on arrays are performed *elementwise*

The `numpy` package provides functions that perform more complex operations on arrays.

• Arithmetic operations on array s are performed elementwise.

doubledata = data * 2.0

- This operation multiplies every array element by 2.0.
- Look at the top right corner of the original array

```
print('original:')
print(data[:3, 36:])
```

Look at the top right corner of the doubled array

```
print('doubledata:')
print(doubledata[:3, 36:])
```

SLIDE NUMPY FUNCTIONS

- numpy provides functions that can perform more complex operations on arrays
- Some of the numpy operations include statistical summaries: .mean(), .min(),
 .max() etc.

print(numpy.mean(data))

- We can asssign the output from these functions to variables
- By default, these functions give summaries of the whole array

```
maxval, minval, stdval = numpy.max(data), numpy.min(data), numpy.std(data)
print('maximum inflammation:', maxval)
print('minimum inflammation:', minval)
print('standard deviation:', stdval)
```

Red sticky for a question or issue

Green sticky if complete

SLIDE SUMMARY BY PATIENT

• What if we want to get summaries patient-by-patient (row-by-row)?

· We can extract a single row into a variable, and calculate the mean

```
patient_0 = data[0, :] # Row zero only, all columns
print('maximum inflammation for patient 0:', patient_0.max())
```

- NOTE: that comments are preceded with a hash # and can be placed after a line of code
- EXPLAIN: why leaving comments is good (can do that in all code not just Jupyter notebooks)
- We can also apply the numpy function directly, without creating a variable

```
print('maximum inflammation for patient 0:', numpy.max(data[0, :]))
print('maximum inflammation for patient 2:', numpy.max(data[2, :]))
```

SLIDE SUMMARY OF ALL PATIENTS

- But what if we want to know about all patients at once?
- Or what if we want an average inflammation per day?
- Writing one line per row, or per column, is likely to lead to mistakes and typos
- · We can specify which axis a function applies to
- MOVE SLIDE TO SCREEN TO DEMONSTRATE AXES 0 AND 1
- •
- Specifying axis=0 makes the function work on columns (days)
- Specifying axis=1 makes the function work on rows (patients)
- RETURN NOTEBOOK TO SCREEN

SLIDE NUMPY OPERATIONS ON AXES

• **numpy** functions take an **axis**= parameter which controls the axis for summary statistic calculations.

```
print(numpy.max(data, axis=1)) # max value for each patient
print(numpy.mean(data, axis=0)) # mean value on each day
```



Green sticky if complete

SLIDE VISUALISATION

SLIDE VISUALISATION

Start a new markdown notebook

```
# Visualisation
```

> "The purpose of computing is insight, not numbers" - Richard Hamming

The best way to gain insight is often to visualise data.

• Visualisation is a large topic that deserves more attention

SLIDE JUPYTER MAGIC

- Jupyter provides another way to control libraries, through *magics*
- matplotlib is the *de facto* standard plotting library in Python
- Do the matplotlib magic
- Note that warnings about fonts may be normal.

```
%matplotlib inline
import matplotlib.pyplot
```

- Import numpy and seaborn
- seaborn is a library that enables attractive graphs and statistical summaries

```
import numpy
import seaborn
```

SLIDE Load data

- · We want to visualise our data, and so we need to load it into a variable in the notebook again
- Load the data again

data = numpy.loadtxt(fname='data/inflammation-01.csv', delimiter=',')

SLIDE MATPLOTLIB .IMSHOW()

• The .imshow() function converts matrix values into an image

image = matplotlib.pyplot.imshow(data)

- Here, small values are white, and large values are black (you can change this colour scheme with other settings...)
- From the image, we can see inflammation rising and falling over a 40-day period for all patients.
- QUESTION: does this look reasonable?

SLIDE MATPLOTLIB .PLOT()

- .plot() shows a conventional line graph
- We're going to use it to plot the average inflammation level on each day of the study
- We'll create the variable ave_inflammation and use numpy.mean() on axis 0 of the data

```
ave_inflammation = numpy.mean(data, axis=0)
ave_plot = matplotlib.pyplot.plot(ave_inflammation)
```

- NOTE: ask students if the data looks reasonable?
- The **data does not look reasonable**. Biologically, we expect a sharp rise in inflammation, followed by a slow tail-off

SLIDE INVESTIGATING DATA

- Since our plot of .mean() values looks artificial, let's check on other statistics to see if we can see what's going on.
- We'll plot the maximum value by day

max_plot = matplotlib.pyplot.plot(numpy.max(data, axis=0))

• NOTE we're not defining a variable, this time

min_plot = matplotlib.pyplot.plot(numpy.min(data, axis=0))

- Ask students if the data looks reasonable?
- The data looks very artificial. The maxima are completely smooth, but the minima are a step function.
- NOTE: we would not have noticed this without visualisation

SLIDE EXERCISE 05

PUT THE EXERCISE SLIDE ON SCREEN

std_plot = matplotlib.pyplot.plot(numpy.std(data, axis=0))

Red sticky for a question or issue

Green sticky if complete

WHEN FINISHED, GO BACK TO THE NOTEBOOK AND PUT THE SLIDES ON THE DESKTOP

SLIDE FIGURES AND SUBPLOTS

- THE CODE ALL NEEDS TO GO IN ONE CELL, BUT WE CAN EXECUTE AFTER EACH SECTION TO SHOW BUILD-UP
- · We can put all three plots we just drew into a single figure
- To do this, we use matplotlib to create a figure, and put it in a variable called fig

fig = matplotlib.pyplot.figure(figsize=(10.0, 3.0)) # Create a figure object

- The figsize argument specifies the width, then the height of the figure being produced, in inches
- We then create three *axes* these are the variables that hold the individual plots
- Using the .add_subplot() function, we need to specify three things:
 - number of rows, number of columns, which cell this figure goes into
 - THIS NEEDS TO BE DRAWN OUT ON THE BOARD

```
axes1 = fig.add_subplot(1, 3, 1)  # Add three subplots
axes2 = fig.add_subplot(1, 3, 2)
axes3 = fig.add_subplot(1, 3, 3)
```

- · Once we've created our plot axes, we can add labels and plots to each of them in turn
- Plot axes properties are usually changed using the .set_<something>() syntax
 - Here we're changing only the label on the y-axis

```
axes1.set_ylabel('average')
axes2.set_ylabel('max')
axes3.set_ylabel('min')
```

- We can plot on an axis by using its .plot() function
 - As before, we can pass the output from the numpy.max() function directly

```
axes1.plot(numpy.mean(data, axis=0))  # Plot the graphs
axes2.plot(numpy.max(data, axis=0))
axes3.plot(numpy.min(data, axis=0))
```

• Finally, we'll tighten up the presentation by using fig.tight_layout() - a function that moves the axes until they are visually pleasing.

```
fig.tight_layout()
```

tidy the figure

Label the graphs

 This is the most demanding code you have written, so far! ROUND OF APPLAUSE FOR YOURSELVES!

SLIDE EXERCISE 06

PUT THE EXERCISE SLIDE ON SCREEN

- Note that it helps to change figsize
- Otherwise the only change is in add_subplot()

```
fig = matplotlib.pyplot.figure(figsize=(3.0, 10.0)) # Create a figure object
axes1 = fig.add_subplot(3, 1, 1) # Add three subplots
axes2 = fig.add_subplot(3, 1, 2)
axes3 = fig.add_subplot(3, 1, 3)
axes1.set_ylabel('average') # Label and plot the graphs
axes1.plot(numpy.mean(data, axis=0))
axes2.set_ylabel('max')
axes2.plot(numpy.max(data, axis=0))
axes3.set_ylabel('min')
axes3.plot(numpy.min(data, axis=0))
fig.tight_layout() # tidy the figure
```

Red sticky for a question or issue

Green sticky if complete

WHEN FINISHED, GO BACK TO THE NOTEBOOK AND PUT THE SLIDES ON THE DESKTOP

• NOW, TO DO MORE INTERESTING THINGS, WE NEED TO LEARN A LITTLE MORE ABOUT PROGRAMMING

SLIDE LOOPS

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SLIDE START A NEW NOTEBOOK

• Create a new notebook, and give it the name loops

Loops

Loops allow us to repeat operations on a series of items.

SLIDE MOTIVATION

- We wrote code that plots values of interest from our dataset
- BUT soon we're going to get dozens of datasets to analyse
- So, we need to tell the computer to repeat our plots and analysis on each dataset
- We're going to do this with for loops
- NOTE: for loops are a fundamental method for program control across nearly every programming language
- NOTE: for loops in python work just like those the learners saw in bash , but are

SLIDE SPELLING BEE

· If we want to spell a word, like 'lead' one letter at a time

```
word = "lead"
```

• We can *index* each letter in turn (just like elements of an array)

```
print(word[0])
print(word[1])
print(word[2])
print(word[3])
```

- But this has some problems ASK LEARNERS WHAT PROBLEMS THEY SEE
- The approach doesn't scale what if our word is hundreds of letters long?
- What if our word is longer than the indices? We don't get all the data; if it's shorter, we get an error.

• demonstrate with oxygen and tin - MODIFY THE WORD IN PLACE

SLIDE FOR LOOPS

- for loops perform an operation *for* every item *in* a collection
- REPLACE THE INDEXING AND DEMO FOR oxygen , lead , and tin

```
for char in word:
    print(char)
```

- Why is this better? ASK THE LEARNERS
- It's shorter code (less opportunity for error)
- It's more flexible and robust it doesn't matter how long word is, the code will still spell it out one letter at a time

SLIDE BUILDING FOR LOOPS

• The general loop syntax is defined by a for statement, and a code block

The general loop syntax is

- The for loop statement ends in a colon, :
- The code block is indented with a tab (\t)

- Everything indented immediately below the for statement is part of the for loop
- There is no command or statement to signify the end of the loop body only a change in indentation
- This is quite different from most other languages (and some people hate Python because of it)

• DEMO THE CODE BELOW

```
for char in word:
    print(char)
    print("I'm in the loop")
    # This is a comment
    print("Still in the loop")
    print("I'm in the loop as well")
    print("Not in the loop")
```

SLIDE COUNTING THINGS

- Code in a for loop can still see variables defined outside the loop
- PUT THE CODE INTO A CELL:

```
length = 0
for vowel in 'aeiou':
    length = length + 1
print('There are', length, 'vowels')
```

- Ask the learners what output they expect
- · Talk through the operations of the loop, if necessary

SLIDE LOOP VARIABLES

- The loop variable alsp still exists once the loop is finished
- PUT CODE IN A CELL

```
letter = 'z'
print(letter)
for letter in 'abc':
    print(letter)
print('after the loop, letter is', letter)
```

- ASK THE LEARNERS WHAT OUTPUT THEY EXPECT
- The value of <u>letter</u> is <u>c</u>, the last updated value in the loop not <u>z</u>, which would be the case if the loop variable only had scope within the loop

......

• Make a markdown cell

```
## `range()`
The `range()` function creates a sequence of numbers
```

- The range() function creates a sequence of numbers.
- The sequence depends on the number and value of arguments given
- RUN DEMO CODE BELOW

```
seq = range(3)
print("Range is:", seq)
for val in seq:
    print(val)
```

Substitute other ranges and run again

```
seq = range(3)
seq = range(2, 5)
seq = range(3, 10, 3)
seq = range(10, 0, -1)
```

- A single value *n* gives the sequence [0, ..., n-1]
- Two values: *m*, *n* gives the sequence [m, ..., n-1]
- Three values: *m*, *n*, *p* gives the sequence [m, m+p, ..., n-1] and skips n-1 if it's not in the sequence.
- NOTE: range() returns a range type that can be iterated over.

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SLIDE EXERCISE 07

PUT THE EXERCISE SLIDE ON SCREEN

```
result = 1
for val in range(3):
    result = result * 5
print(result)
```

SLIDE EXERCISE 08

```
instr = "Newton"
outstr = ""
for char in instr:
    outstr = char + outstr
print(outstr)
```

WHEN FINISHED, GO BACK TO THE NOTEBOOK AND PUT THE SLIDES ON THE DESKTOP

SLIDE enumerate()



The `enumerate()` function creates paired indices and values for elements of a sequence

DEMO CODE BELOW

```
seq = enumerate('aeiou')
print("Sequence is:", seq)
for idx, val in seq:
    print(idx, val)
***
***SLIDE** USING `enumerate()`
* We can use enumerate to index lists in order, which can be very useful in a variety of c
* **PUT THE MARKDOWN IN THE NOTEBOOK**
**`markdown
Calculate $y$ when $x=5$ when the coefficients are `coeffs = [2, 4, 3, 2, 1]`:
$$y = a_0 + a_1 x + a_2 x^2 + a_3 x^3 + a_4 x^4$$
```

We can solve this with a little Python

```
x = 5
coeffs = [2, 4, 3, 2, 1]
y = 0
for idx, val in enumerate(coeffs):
    y = y + val * (x ** idx)
```

print(y)

SLIDE LISTS

SLIDE START A NEW NOTEBOOK

```
# Lists
Lists are a built-in `Python` datatype, describing ordered collections of elements.
Lists are defined by comma-separated values, in square brackets.
```

SLIDE LISTS

· Lists are defined as ordered lists of values, in square brackets, separated by commas

```
odds = [1, 3, 5, 7]
print('odds are:', odds)
```

They can be indexed and sliced, as seen for arrays

```
print('first and last:', odds[0], odds[-1])
print(odds[2:])
```

They can be iterated over, in loops

```
for number in odds:
    print(number)
```

SLIDE MUTABILITY

Mutability `Python` has a concept of mutability. Items that can be changed in-place are *mutable*. Th Lists are *mutable*, strings are *immutable*.

 list s and string s are both sequences, BUT you can change the elements in a list, after it is created: lists are mutable

```
names = ['Newton', 'Darwing', 'Turing'] # typo in Darwin's name
print('names is originally:', names)
```

We have a typo - let's correct it

```
names[1] = 'Darwin' # correct the name
print('final value of names:', names)
```

string s are NOT mutable

```
name = 'Darwin'
name[0] = 'd'
```

SLIDE CHANGER DANGER

- There are risks associated with modifying lists in-place
- Rather than make copies of lists, when assigned to more than one variable, Python will make

reference to the original list

DEMO CODE

```
my_list = [1, 2, 3, 4]
your_list = my_list
print("my list:", my_list)
my_list[1] = 0
```

ASK LEARNERS WHAT THEY THINK your_list contains

```
print("your list:", your_list)
```

• If two variables refer to the same list, any changes to that list are reflected in both variables.

......

```
SLIDE LIST COPIES
```

- To avoid this kind of effect, you can make a *copy* of a list by *slicing* it, or using the list() function that returns a new list
- **DEMO CODE MODIFY THE CODE ABOVE IN-PLACE IN THE NOTEBOOK **

```
my_list = [1, 2, 3, 4]
your_list = my_list[:]
print("my list:", my_list)
print("your list:", your_list)
my_list[1] = 0
print("my list:", my_list)
print("your list:", your_list)
```

```
my_list = [1, 2, 3, 4]
your_list = list(my_list)
print("my list:", my_list)
print("your list:", your_list)
my_list[1] = 0
print("my list:", my_list)
print("your list:", your_list)
```

Red sticky for a question or issue



.....

Green sticky if complete

SLIDE NESTED LISTS

ADD MARKDOWN CELL

```
## Nested `list`s and `list` functions
A `list` can contain any other datatype - even another `list`!
```

- list s can contain any datatype, even other lists
- Imagine we have a grocery store with three shelves, and the items on the shelves are arranged with {pepper, zucchini, onion} on the top shelf, {cabbage, lettuce, garlic} on the middle shelf, and {apple, pear, banana} on the lower shelf.
- We can represent this in a *nested list*: one list per shelf, and a list that contains the three lists, to represent the grocery store.
- Demo code

```
shelves = [['pepper', 'zucchini', 'onion'],
       ['cabbage', 'lettuce', 'garlic'],
       ['apple', 'pear', 'banana']]
```

NOTE: This should remind you of the numpy array you loaded earlier! Work through the code below

```
print(shelves[0])
print([shelves[0]])
print(shelves[0][0])
```

SLIDE LIST FUNCTIONS

- list s are Python objects and have a number of useful functions to modify their contents
- .append() adds a value to the end of the list

```
odds.append(9)
print("odds after adding a value:", odds)
```

.reverse() reverses the order of list items

```
odds.reverse()
print("odds after reversing:", odds)
```

.pop() returns the last item in the list, removing it from the list

```
print(odds.pop())
print("odds after popping:", odds)
```

SLIDE OVERLOADING

- We can add (+) and multiply (*) lists, even though they're not really arithmetic operations
- Overloading refers to an operator (e.g. +) having more than one meaning, depending on the thing it operates on.

```
vowels = ['a', 'e', 'i', 'o', 'u']
vowels_welsh = ['a', 'e', 'i', 'o', 'u', 'w', 'y']
print(vowels + vowels_welsh)
```

NOTE: multiplication of lists does not work like multiplication of numpy arrays

```
counts = [2, 4, 6, 8, 10]
repeats = counts * 2
print(repeats)
```

• Ask the learners what 'addition' (+) and 'multiplication' (*) do for lists

SLIDE MAKING CHOICES

SLIDE START A NEW NOTEBOOK

- Call it choices
- Add an introduction cell

```
# Making Choices
We often want to make the computer perform one task if some condition is true, but a diffe
```

Add the Python code to the markdown

```
if <condition>:
    <executed if condition is True>
```

SLIDE CONDITIONALS

- We often want the computer to do <something> if some condition is true
- To do this, we can use an if statement
 - if statements end in a colon (:)
 - they also have a *condition* the condition is evaluated and, if found to be true, the code block is executed
 - The code block is *indented* as was the case with the for loop
- EXECUTE CODE

```
num = 37
if num > 100:
    print('greater')
print('done')
```

• CHANGE NUMBER TO VARIOUS VALUES IN THE SAME CELL

num = 137 num = 100

- Any condition that might evaluate to True or False can be used:
- SHOW A DIFFERENT TEST

```
if 'atlas' == 'atlas':
    print("the same")
```

SLIDE IF-ELSE STATEMENTS

- An if statement executes code if the condition evaluates as true
- But what if the condition evaluates as false ?
- The **else** structure is like the if structure
 - it ends in a colon (:)
 - the indented code block beneath it executes if the condition is false
- MAKE CHANGES AND EXECUTE CODE IN EXISTING CELLS

```
num = 37
if num > 100:
    print('greater')
else:
    print('not greater')
print('done')
```

```
if 'atlas' == 'atlash':
    print("the same")
else:
    print('different')
```

SLIDE CONDITIONAL LOGIC

- OPTIONALLY SHOW THIS SLIDE
- Describe flowchart

......

......

SLIDE IF-ELIF-ELSE CONDITIONALS

- We can chain conditional tests together with elif (short for else if)
- The elif statement structure is the same as the if statement structure
 - the indented code block is executed if the condition is true, and no previous conditions have

been met.

• EXECUTE DEMO CODE IN EXISTING CELL

```
num = -3
if num > 0:
    print(num, "is positive")
elif num == 0:
    print(num, "is zero")
else:
    print(num, "is negative")
```

• NOTE: the test for equality is a double-equals!

Red sticky for a question or issue

Green sticky if complete

SLIDE COMBINING CONDITIONS

- We can combine conditions using *Boolean Logic*
- Operators include and , or and not

• EXECUTE CODE IN NEW CELL

```
if (1 > 0) and (-1 > 0):
    print('both parts are true')
else:
    print('at least one part is false')
```

• VARY THE CODE IN PLACE

```
if (4 > 0) and (2 > 0):
    print('both parts are true')
else:
    print('at least one part is false')
```

```
if (4 > 0) or (2 > 0):
    print('at least one part is true')
else:
    print('both parts are false')
```

SLIDE EXERCISE 09

- PUT THE EXERCISE SLIDE ON SCREEN
- MCQ: Put up four stickies

Solution: C

WHEN FINISHED, GO BACK TO THE NOTEBOOK AND PUT THE SLIDES ON THE DESKTOP

SLIDE MORE OPERATORS

ADD THE MARKDOWN

## Operators	
* `==` (equals)	
* `in`	

- · These are two operators you will meet and use frequently
- == (double-equals) is the equality operator, and returns True if the left-hand-side value is equal to the right-hand-side value
- DEMO CODE

```
print(1 == 1)
print(1 == 2)
```

• in is the **membership operator**, and returns **True** if the left-hand-side value is in the right-hand-side value

DEMO CODE

```
print('a' in 'toast')
print('b' in 'toast')
print(1 in [1, 2, 3])
print(1 in range(3))
print(1 in range(2, 10))
```

SLIDE ANALYSING MULTIPLE FILES

SLIDE START A NEW NOTEBOOK

- Call it files
- ADD NEW HEADER CELL

```
# Analysing Multiple Files
```

We're now almost ready to start analysing multiple files of inflammation data.

ADD IMPORTS

```
%matplotlib inline
import matplotlib.pyplot
import numpy
import seaborn
```

SLIDE ANALYSING MULTIPLE FILES

- We have received several files of data from the inflammation studies, and we would like to perform the same operations on each of them.
- We have learned how to open files, read data, visualise data, loop over data, and make decisions based on that content.
- Now we need to know how to interact with the *filesystem* to get our data files.

SLIDE THE OS MODULE

• New Markdown cell

```
## The `os` module
```

Allows us to interact with the computer's filesystem

- To interact with the filesystem, we need to import the os module
- This allows us to interact with the filesystem in the same way, regardless of the operating system we work on! INTEROPERABILITY AND REPRODUCIBILITY
- IMPORT THE MODULE

```
import os
```

```
SLIDE OS.LISTDIR
```

• The .listdir() function lists the contents of a directory

```
os.listdir('.')
```

- Our data is in the 'data' directory
- Reuse the cell

```
os.listdir('data')
```

- We only want inflammation data so we would like to ignore the small files
- We want to turn the list from os.listdir() into a list that contains only inflammation* files: use for loop and if to filter
- The list can be filtered with a for loop or list comprehension

```
for file in os.listdir('data'):
    if 'inflammation' in file:
        print(file)
```

- We'd like to work with this set of files, so we store it in a variable, called files.
- A suitable data type here is a list, and we can populate it one file at a time, using .append()
- ADAPT THE EXISTING CELL

```
files = []
for file in os.listdir('data'):
    if 'inflammation' in file:
        files.append(file)
print(files)
```

SLIDE OS.PATH.JOIN

• The **os.listdir()** function only returns filenames, not the *path* (relative or absolute) to those files.

.....

- WE NEED THE FULL PATH TO A FILE TO BE ABLE TO USE IT
- To construct a path, we can use the os.path.join() function.
- os.path.join() takes directory and file names, and returns a path built from them as a string, suitable for the underlying operating system.
- This is useful for making code shareable and usable on all OS/computers
- EXAMPLE CODE IN NEW CELL

```
os.path.join('parent', 'child', 'file.txt')
os.path.join('data', 'inflammation-01.csv')
```

MODIFY PREVIOUS CELL TO GET

```
files = []
for file in os.listdir('data'):
    if 'inflammation' in file:
        files.append(os.path.join('data', file))
print(files)
```

SLIDE VISUALISING THE DATA

Add markdown

Visualising data

```
We can now load data from each file in turn, and visualise the mean, minimum and maximum v
```

• Now we have all the tools we need to load all the inflammation data files, and visualise the mean,

minimum and maximum values in an array of plots.

- We can get a list of paths to the data files with os and a list comprehension
- We can **load data from a file** with numpy.loadtxt()
- We can calculate summary statistics with numpy.mean(), numpy.max(), etc.
- We can **create figures** with matplotlib, and arrays of figures with .add_subplot()

SLIDE VISUALISATION CODE

- BUILD THE CODE IN STAGES
- 1 show that we see each filename in turn python for file in files: print(file)
- 2 show the data in each file

```
for file in files:
    print(file)

    # load data
    data = numpy.loadtxt(fname=file, delimiter=',')
    print(data)
```

• 3 - create a figure for each file

```
for file in files:
    print(file)

    # load data
    data = numpy.loadtxt(fname=file, delimiter=',')

    # create figure and axes
    fig = matplotlib.pyplot.figure(figsize=(10.0, 3.0))
    axes1 = fig.add_subplot(1, 3, 1)
    axes2 = fig.add_subplot(1, 3, 2)
    axes3 = fig.add_subplot(1, 3, 3)
```

• 4 - decorate the axes

```
for file in files:
    print(file)
    # load data
    data = numpy.loadtxt(fname=file, delimiter=',')
    # create figure and axes
    fig = matplotlib.pyplot.figure(figsize=(10.0, 3.0))
    axes1 = fig.add_subplot(1, 3, 1)
    axes2 = fig.add_subplot(1, 3, 2)
    axes3 = fig.add_subplot(1, 3, 3)
    # decorate axes
    axes1.set_ylabel('average')
    axes2.set_ylabel('average')
    axes3.set_ylabel('maximum')
    axes3.set_ylabel('minimum')
```

• 5 - plot the data

```
for file in files:
    print(file)
    # load data
    data = numpy.loadtxt(fname=file, delimiter=',')
    # create figure and axes
    fig = matplotlib.pyplot.figure(figsize=(10.0, 3.0))
    axes1 = fig.add_subplot(1, 3, 1)
    axes2 = fig.add_subplot(1, 3, 2)
    axes3 = fig.add_subplot(1, 3, 3)
    # decorate axes
    axes1.set_ylabel('average')
    axes2.set_ylabel('maximum')
    axes3.set_ylabel('minimum')
    # plot data
    axes1.plot(numpy.mean(data, axis=0))
    axes2.plot(numpy.max(data, axis=0))
    axes3.plot(numpy.min(data, axis=0))
```

6 - tidy and show plot



• Show the collapse/expand click option in the notebook

Red sticky for a question or issue



SLIDE CHECKING DATA

- There are two suspicious features to some of the datasets
- 1. The maximum values rose and fell as straight lines
- 2. The minimum values are consistently zero
- We'll use if statements to test for these conditions and give a warning

SLIDE TEST FOR SUSPICIOUS MAXIMA

- Is day zero value 0, and day 20 value 20?
- ADD TO EXISTING CODE BEFORE PLOT

```
if numpy.max(data, axis=0)[0] == 0 and numpy.max(data, axis=0)[20] == 20:
    print('Suspicious looking maxima!')
```

SLIDE SUSPICIOUS MINIMA

- Are all the minima zero? (do they sum to zero?)
- ADD TO EXISTING CODE BEFORE PLOT AS ELIF

```
elif numpy.sum(numpy.min(data, axis=0)) == 0:
    print('Minima sum to zero!')
```

SLIDE BEING TIDY

- If everything's OK, let's be reassuring
- ADD TO EXISTING CODE BEFORE PLOT



- But it's not how most people write Python day-to-day
- We'll use our notebook as the basis for a script

SLIDE DOWNLOAD PYTHON CODE

- Download the notebook as a script: File -> Download As -> Python
- It will download as files.py

PUT THE TERMINAL ON SCREEN

- Move the file to your working directory
- OPEN THE FILE WITH AN EDITOR

- files.py is a plain text file, containing Python code and comments, from your notebook
- · All the Markdown has been converted to comments
- All the In[] and Out[] markers are also now comments

SLIDE RUN PYTHON CODE

- In the editor
 - COMMENT OUT get_ipython().magic('matplotlib inline') magic
- In the terminal
 - RUN python files.py
- OUTPUT MAY DIFFER DEPENDING ON INDIVIDUALS' SETUPS ASK WHAT THEY SEE

SLIDE Edit PYTHON CODE

- · Seeing each image in turn is not convenient
- We'll write each image to file instead of viewing it
- EDIT SAVE EXECUTE cycle
- EDIT THE FILE AS SHOWN BELOW

```
# matplotlib.pyplot.show()
outfile = file + '.png'
print("Writing PNG to", outfile)
matplotlib.pyplot.savefig(outfile)
```

• The files are placed in the data directory

SLIDE CONCLUSIONS

PUT THE SLIDES ON SCREEN

......

SLIDE LEARNING OUTCOMES

- Jupyter notebooks
- variables
- data types: arrays, lists, strings, numbers
- file IO: loading data, listing files, manipulating filenames
- calculating statistics
- · plotting data: plots and subplots
- · program flow: loops and conditionals

- automating multiple analyses
- Python scripts: edit-save-execute

......

SLIDE WELL DONE!

• SEND THEM HOME HAPPY!