# MATH1166 Problem Solving and Mathematical Thinking 

Programming for Mathematics ${ }^{1}$

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"This, therefore, is Mathematics; she reminds you of the invisible form of the soul; she gives life to her own discoveries; she awakens the mind and purifies the intellect; she brings light to our intrinsic ideas..."

Proclus 414-485 AD

[^0]
## Contents

(1)

Introduction

- Module Aims and Assessment
- Topics to be Covered
- Reading List and References

Week 5: Data and Visualisation with Excel

- What is Excel?
- Data Entry and Functions
- Visualisation Methods
- Tables and Pivots
(3)

Week 6: Introduction to Python 3

- What is Python?

O Installing and Running

- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpy
(4)

Week 7: Data Types, Methods, and
Programming

- Code and Data
- Data Types: int, str, bool, float, complex
- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

Week 8: Conditional Statements and Loops

O if, else, and elif Statements

- for and while Loops

O break and continue Statements
6
Week 9: Built-in and User-Defined Functions

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda

Week 10: Matrices, Dataframes, and Data Manipulation

- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()

Week 11: Statistics and Visualisation Methods

- Statistics with scipy
- Plotting with matplotlib
- Interactive Plots with plotly

Week 12: Numerical Algorithms

- Introduction to Numerical Analysis
- Roots of Nonlinear Equations
- The Bisection Method
- Error for Bisection Method


## Lecture Contents

Introduction

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- Topics to be Covered
- Reading List and References

Week 5: Data and Visualisation with Excel

- What is Excel?
- Data Entry and Functions

O Visualisation Methods

- Tables and Pivots
(3) Week 6: Introduction to Python 3

What is Python?

- Installing and Ruming
- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpy
(4)

Week 7: Data Types, Methods, and
Programming

- Code and Data
- Data Types: int, str, bool, float, complex
- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

Week 8: Conditional Statements and Loops

- if, else, and elif Statements
- for and while Loops
- break and continue Statements

Week 9: Built-in and User-Defined Functions

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda

Week 10: Matrices, Dataframes, and Data Manipulation

- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()

Week 11: Statistics and Visualisation
Methods

- Statistics with scipy
- Plotting with matplotlib
- Interactive Plots with plotly

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- Introduction to Numerical Analysis
- Roots of Nonlinear Equations
- The Bisection Method
- Error for Bisection Method


## Introduction

## Aims

The aim of this part of the module is to provide an overview of modern computer skills essential for mathematicians. In particular, by the end of this part you will be able to...
(1) Manipulate data and produce graphics for visualisation using Excel.
(2) Learn programming with Python, data type, create functions, control flow, manipulate data, and produce visualisations.
(3) Design programmes for solving mathematical problems and data analysis.

## Assessment

Computing Assignment (Electronic submission), weight 30\%, release 10/12/2019, due 06/02/2020.

## Introduction

## Topics to be Covered...

(1) Data and Visualisation with Excel
(2) Introduction to Python 3
(3) Data Types, Methods, and Programming
(1) Conditional Statements and Loops
(6) Built-in and User-Defined Functions
(6) Matrices, Dataframes, and Data Manipulation
(1) Statistics and Visualisation Methods
(8) Numerical Algorithms

## Guidance for Success

Attend Lectures, Engage with Tutorials, Ask Questions, Read Books, Use Online Resources (Google, YouTube, etc...), Keep Your Work Organised, and Always Ask for Help.

## Suggested Reading List and References

For reading list see Guerrero (2018); Alexander et al. (2018); Kalb (2018); Summerfield (2008); Johansson (2015).

Alexander, M., R. Kusleika, and J. Walkenbach
2018. Excel 2019 Bible, Bible. Wiley.

Guerrero, H.
2018. Excel Data Analysis: Modeling and Simulation. Springer International Publishing.
Johansson, R.
2015. Numerical Python: A Practical Techniques Approach for Industry. Apress.
Kalb, I.
2018. Learn to Program with Python 3: A Step-by-Step Guide to Programming. Apress.
Summerfield, M.
2008. Programming in Python 3: A Complete Introduction to the Python Language. Pearson Education.

## Class Activity with www.menti.com

Please scan the barcode with your phone in order to take part in the class activity.

https://www.menti.com/xt4nbvqhhu
Alternatively, go to www.menti.com on your electronic devices and enter the access code 74285.

## Week 5 <br> Data and Visualisation with Excel

$$
\otimes \frac{\sin (r)}{r}
$$



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Introduction

- Module Aims and Assessment
- Topics to be Covered
- Reading List and References


Week 5: Data and Visualisation with Excel

- What is Excel?
- Data Entry and Functions
- Visualisation Methods
- Tables and Pivots

Week 6: Introduction to Python 3
What is Python?

- Installing and Rumning
- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpyWeek 7: Data Types, Methods, and
Programming
- Code and Data
- Data Types: int, str, bool, float, complex
- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

Week 8: Conditional Statements and Loops
if, else, and elif Statements

- for and while Loops
- break and continue Statements

Week 9: Built-in and User-Defined Functions

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda

Week 10: Matrices, Dataframes, and Data Manipulation

- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()

Week 11: Statistics and Visualisation
Methods

- Statistics with scipy
- Plotting with matplotlib
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Week 12: Numerical Algorithms

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- The Bisection Method
- Error for Bisection Method


## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Understand the basic uses of Excel.
(2) Create graphs of functions and visualise qualitative or quantitative data.
(3) Lean to modify the appearance of Excel graphics.
(1) Produce summary tables from data.

## What is Excel?

- Excel is spreadsheet software which is used for storage, organisation, and analysis of tabular data.
- First version was released by Microsoft in 1985 - it remains the most popular among business applications used for
(1) Number crunching: create budgets, tabulate expenses, analyse survey results.
(2) Creating graphics: customizable graphics and dashboards for business/academic reports.
(3) Data manipulation: preform complex calculations on data as well as tools to manipulate text based data.


## Remark 1: Why NOT Use Excel?

Unprecedented increase in data production has led businesses to use open source fast performance programming languages such as Python and $\mathbf{R}$ for visualisation and data analysis.

## Excel Interface

We shall look at data entry, functions, graphics, and tables in Excel.


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## Data Entry and Functions

Use in-built functions
Click on "Formulae" then "Insert Function"

Data entry in the cells

Preform mathematical operations on data


Some In-Built Functions (here " $=$ " means written as)

$$
\begin{gathered}
n x=n * x, x^{n}=x^{\wedge} n, \pi=\operatorname{pi}() \\
\cos (x), \ln (x), e^{x}=\exp (x), \sqrt{x}=\operatorname{sqrt}(x), \text { etc... }
\end{gathered}
$$

## Graphics

- In many scenarios we would like to have a graphical representation of data.
- Graphics can summarise data in a way that tables, or numerical values can never do.
- First we need to think about what type of data we are dealing with.


## Quantitative Data

This is also refereed to as numerical data; it comes as continuous or discrete.

## Qualitative Data

This is also referred to as categorical data; it comes as binary, nominal, or ordinal.

## Examples and Exercises

## Example

- Quantitative: weight or number of people in a room.
- Qualitative: true/false, red/blue/yellow, or good/OK/bad.


## Exercise 1: Research and Find

(1) More examples of quantitative and qualitative data.
(1) Methods of visualisation for each quantitative and qualitative data.
(1) Meaning of exploratory and explanatory analysis.

Submit your findings in https://www.menti.com/xt4nbvqhhu.

## Quantitative Visualisation

There are three steps:


## Quantitative Visualisation

Results:


## Exercise 2:

Create exactly the following two graphs.


## Qualitative Visualisation: Tables

Suppose we have the following data.


Read more on Guerrero 2018, Chapter 2 or Alexander et al. 2018. Part III.

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## Qualitative Visualisation: Pivot Tables

We can create summary tables first and then use visualisation.


## Qualitative Visualisation: Pivot Tables

Results. Play around with options on the right hand side to obtained desired tables.


## Exercise 3:

Create the following pivot table and graphics.


Read more on Guerrero 2018, Chapter 4 or Alexander et al. 2018, Part IV.

## Important to Remember

## Audience

Understand your audience and context. A graphics can be worth a thousand words, or confusing if badly produced!

## Research

Choose visuals carefully, compare several and go for the best, or learn from experts through prior research.

## Clutter and Design

Avoid clutter: remember sometimes less is more. Design your graphics professionally. Avoid using pie charts, doughnut charts, or 3D bar charts.

## Storytelling

Think about your audience and what you want them to see. Accompany graphics with a brief story of what they show.

## Summary

What we did today．．．

Basics of Excel

| Data | History and applications |
| :--- | :--- |
| Do＇s and Dont＇s | Types and visualisations |
| Exercises | Remember them |

Go through and check solutions
Need Help？
Email me or ask me any questions
Next Time
Python 3 ロロロ

## Week 6

## Introduction to Python 3

```
# Python 3: Fibonacci Series up to n
```

def fib(n):
$\mathrm{a}, \mathrm{b}=0,1$
while $\mathrm{a}<\mathrm{n}$ :
print (a, end=' ')
$\mathrm{a}, \mathrm{b}=\mathrm{b}, \mathrm{a}+\mathrm{b}$
fib(1000)
$\begin{array}{llllllllllllllll}0 & 1 & 1 & 2 & 3 & 5 & 8 & 13 & 21 & 34 & 55 & 89 & 144 & 233 & 377 & 610 \\ 987\end{array}$

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- Reading List and References

Week 5: Data and Visualisation with Excel

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- Visualisation Methods
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Programming

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- Import Data pandas.read_excel()


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 Methods- Statistics with scipy
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## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Understand what Python is as a programming language.
(2) Learn how to install and work with different interfaces of Python.
(3) Preform basic operations and mathematical calculations.
(1) Learn about Python packages and how to use some of them.

## What is Python?

- Python is an Object-Oriented, General Purpose, Interpreted, programming language.
- It was created in 1990s by Guido van Rossum, and it has become the easiest-to-learn and nicest-to-use programming language.
- Python is used to write applications to solve problems in mathematics, numerical and financial analysis, neurosciences, biology, and many others areas https://www.youtube.com/watch?v=hxGB7LU4i1I.
- It remains the top choice of language for data science in industry alongside the more statistical language $\mathbf{R}$.
- After learning Python it will be easier to learn other programming languages.


## Class Activity

## Exercise 1: Research to Find Definition and Example

(1) An algorithm
(1) A computer programme
(1) Programming language (including higher/lower)
© General Purpose language

- Object-Oriented programming
(1) Interpreted and Compiled programming language

Submit your findings in https://www.menti.com/sdoiiq8pes.

## How to Get Python?

## Getting Python

Python is open source, freely available, from www.python.org
there are two versions: old Python 2 and new Python 3. We will learn Python 3.

## Online Documentations

The above website also contains vast amount of information about Python and should be your first point of contact. For example, go to Tutorial on
https://docs.python.org/3

## Remark 1: Google Everything!

Remember programming and Googling go hand in hand. Make sure you use the extensive online resources available.

## Python

Once installed, open a Python shell, type python in the Command Prompt (Windows) or Terminal (MAC/Linux). Or click on any Python icon you find on your system.


## Basic Programming

- A programme is set of instructions asking a computer to preform a task.
- It is a way of speaking to machines and you need to be precise, logical, and understand the rules of each language carefully.
- Computer reads your programme in the order of appearance. For example, the code print("Hello World") produces

```
>>> print("Hello World!")
```

Hello World!

- Function print is used to tell Python to display an output. Note, Python functions are case sensitive!

```
>>> Print("Hello World!")
Traceback (most recent call last):
File "<stdin>", line 1, in <module>
NameError: name 'Print' is not defined
```


## Indentation and Comments

## Remark 2: Indentation Matters in Python!

Indentation of code helps with the readability of programmes, but will produce errors if used incorrectly!

```
>>> print("Hello World!")
Hello World!
>>> print("Hello World!")
File "<stdin>", line 1
print("Hello World!")
```

IndentationError: unexpected indent

## Remark 3: Always Comment Your Code!

Anything that comes after a \# will not be executed by Python, so you can use this to comment you codes
> >>> print("Hello World!") \# This will print
> Hello World!

## Basic Mathematics

- You can use Python as a calculator with operations

$$
+,-, *, /, * *
$$

for addition, subtraction, multiplication, division, and exponentiation. For example, $\left(\frac{(2+5) \times 5}{10}\right)^{2}$ is written
>>> $((2+5) * 5 / 10) * * 2$
12.25

- The order of mathematical operations follows PEMDAS:
(1) Parentheses
(2) Exponents
(3) Multiplication
(1) Division
(6) Addition
(0) Subtraction


## Exercise 2: Research - Interfaces for Python

- Find from internet if you can get Python 3 on your phone, or smart devices.
- Find suitable online Python Compilers, e.g., https://www.tutorialspoint.com/execute_python_online.php.
- Type the following codes to see what you get.

1 print("Hello World")
2 $2+2$
3 print (2+2)
4 print (" $2+2$ ")
5 print('2+2')
6 \# print("2+2")
$7 \mathrm{x}=2$
$8 \quad x+2$
9 help(print)
10 Hello World

- Write the code on first slide of this session (slide 25).


## Interfaces for Python and IDLE

Programming in the terminal can be difficult and time consuming. For this reason Python programmers often use user friendly interfaces and scientific distributions.

## IDLE

The Integrated Development and Learning Environment (IDLE) for Python offers many features; for example, ability to save codes, code colouring, smart indent, auto completion, interactivity, debugger, and many others.

## Anaconda

Another way to get access to Python interfaces is through scientific distribution Anaconda, available from
www.anaconda.com
already equipped with many packages and interfaces such as Spyder, Jupyter, JupyterLab.

IDLE interface comes with Python installation.


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## IDLE

## You can save your code by creating a .py file by going to File and selecting New File.



## Anaconda Interface



## Spyder

- Spyder www.spyder-ide.org is a scientific environment in Python. You can access it through Anaconda.
- It has advanced features for editing, analysis, debugging, interactive execution, and beautiful visualisation capabilities. You can add Notebook and Reports.


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MATH1166

## Jupyter(Lab)

- Jupyter(Lab) www.jupyter.org is an interactive development environment.
- Jupyter(Lab) opens in a browser and allows to write code, text, and mathematics in the same script to produce interactive documents.



## Accessing Python using UoG Technology

- While at the University of Greenwich you should be able to access Python and Anaconda on most computers.
- Alternatively you can also get access to them through Virtual Lab Desktop.
- Find instructions on how to use Virtual Lab Desktop on http://ach-support.gre.ac.uk/labdesktop/.
- You can install this at home or on a tablet, phone or other device, following these instructions.


## Packages for Python

- No all the tools that programmers need are already built into Python.
- Packages, Modules, and Libraries increase the functionality of Python by offering tools useful for particular tasks.
- Some packages already exist in Python (for example pip, math, statistics, etc...) and some need to be installed.
- To load an existing package use import in Python
>>> import <package-name>
- To install ${ }^{3}$ use pip in the terminal
\$> pip install <package-name>
- To update a package to the latest version use
\$> pip install -U <package-name>

[^1]
## Packages for Anaconda

## Anaconda

- Has many packages already installed.
- You can update Anaconda by running
\$> conda update conda
- You can install a package by
\$> conda install <package-name>
- You can update a package by
\$> conda update <package-name>
- You can update all packages by
\$> conda update --all
- Finally to remove a package use
\$> conda remove <package-name>


## Exercise 3: Playing with numpy

NumPy provides multidimensional arrays functions to operate on arrays. To load type

## import numpy

- Figure out what the following lines of code do.

```
a = numpy.array([[6, 7, 8],[1, 2, 3]])
a
a.shape
a.ndim
a.size
type(a)
numpy.arange(15).reshape(3, 5)
numpy.zeros((3,4))
```

- You can load a package and give it a different name.

```
import numpy as np
a = np.array([[6, 7, 8],[1, 2, 3]])
```


## Useful Packages

Some useful and well-known packages of Python which we shall learn about.
(1) NumPy www.numpy.org operation on data stored in arrays, linear algebra, Fourier transform, and random number.
(2) SymPy www.sympy.org is used for symbolic mathematics, calculus, and number theory.
(3) Pandas www.pandas.pydata.org provides high-performance, easy-to-use data structures and data analysis tools.
(1) SciPy www.scipy.org mathematics, statistics, science, and engineering, integration, differentiation, gradient optimization.
(0) Matplotlib www.matplotlib.org is a Python 2D plotting library which produces publication quality figures.
© Ployly www.plot.ly/python Plotly's Python graphing library makes interactive, publication-quality graphs.

## Useful Packages

More sophisticated well-known packages of Python.
(1) Scikit-learn www.scikit-learn.org/stable simple and efficient tools for data mining and data analysis.
(2) Theano www.deeplearning.net/software/theano, define, optimize, and evaluate mathematical expressions involving multi-dimensional arrays efficiently.
(3) Beautiful Soup www.crummy.com/software/BeautifulSoup Pythonic idioms for navigating, searching, and modifying a parse tree in HTML for extracting data from the web.
(1) Seaborn www.seaborn.pydata.org/ data visualization library based on matplotlib. It provides a high-level interface for drawing attractive and informative statistical graphics.

## Summary

What we did today...
Programming
Object-Oriented
Basics of Python

Interfaces
History, applications, packages

IDLE, Spyder, JupyterLab
Error and Basic Operations
Case sensitive, indentation, comments
Mathematical Operation and Packages

Order of operations
Data Types, Methods, Programming

## Week 7

## Data Types, Methods, and Programming

| \# Keywords in Python |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| False | class | finally | is | return |
| None | continue | for | lambdal | try |
| True | in | nonlocal | while | raise |
| and | del | global | not | with |
| as | elif | if | or | yield |
| assert | else | import | pass |  |
| break | except | def fr |  |  |

## Lecture Contents



Introduction

- Module Aims and Assessment
- Topics to be Covered
- Reading List and References

Week 5: Data and Visualisation with Excel

- What is Excel?
- Data Entry and Functions
- Visualisation Methods
- Tables and Pivots
(3)

Week 6: Introduction to Python 3

- What is Python?
- Installing and Running
- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpy
(4)

Week 7: Data Types, Methods, and Programming

- Code and Data
- Data Types: int, str, bool, float, complex
- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

Week 8: Conditional Statements and Loops
if, else, and elif Statements

- for and while Loops
- break and continue Statements

Week 9: Built-in and User-Defined Functions

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda

Manipulation

- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()


## Week 11: Statistics and Visualisation

Methods

- Statistics with scipy
- Plotting with matplotlib
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- The Bisection Method
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## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Understand different data types - integer, floats, strings, Boolean, and methods.
(2) Learn about variables, assignment statements, conventions, and keywords.
(3) Manipulate different data collection types - tuples, lists, sets, dictionaries, and ranges.
(1) Learn about logical and comparison operations.
(3) Apply the concepts learnt to write and test Python programmes.

## Introduction

## Last Week

We learnt how to use Python with different interfaces and played around with codes and packages.

- Think about what we learnt last week: choices for programming in Python; mathematical operators and their order in Python; print function; and packages and answer questions in https://www.menti.com/im5r1bitpb.


## This Week

- We look at more technical aspects of programming and how to use Python.
- This is very useful as you will develop a concrete knowledge of programming which will remain with you as when learning other languages.
- You will research and programme during the session through exercises in order to gain a fully proficiency of the concepts.


## Building Blocks of Programming

- Code and Data The main building blocks of programming are code and data.
- Code (or method) is a set of instructions that tell the computer what to perform and how it should perform.
- Data refers to the quantities, characters, and/or symbols on which operations are performed. Anything the computer needs to remember is a piece of data.
- RAM and CPU

Inside a computer...

- Ready programme is loaded into RAM, random access memory.
- The CPU, central processing unit, executes the instructions of the programme.
- Instructions usually boil down to load data, preform arithmetic, make comparisons, and store data.


## Data Types

## Example (Data)

- Number of students in class
- Examination marks average
- Name of students
- Whether a switch is in an on or off position
- Solutions of the equation $x^{2}+1=0$


## Question

What is the difference between the data in the examples above?

## Types of Data

In we shall look at four main types.

- Integers numbers (integers) are counting numbers, like 1, 2, 3 , but also include 0 and negative numbers, e.g., number of people in a room.
- Floating-point numbers (floats) are numbers that have a decimal point in them, e.g., price of beard; irrational numbers.
- Strings (text) are any sequences of characters e.g., name, address.
- Booleans are a type of data that can only have one of two values: True or False, e.g., the state of a light switch: True for on, False for off.


## Remark 1:

(1) Integers seem to be included in floats, but computer has easier time dealing with integers than floats!
(2) There are many types of data for example MP3, JPG, PDF.

## Type Function

You can use the function type() to determine the type of data.

## Exercise 1: Research and Find

(1) Five examples for each of the four data type integers, floats, strings, and Booleans.
(1) Suppose you are required to create the following table in Python

Receipt of Purchase

| Name: | $\ldots \ldots \ldots \ldots \ldots \ldots$ |
| ---: | :--- |
| Date of Birth: | $\cdots \ldots \ldots \ldots \ldots \ldots$ |
| Address: | $\cdots \ldots \ldots \ldots \ldots$ |
| Phone Number: | $\cdots \ldots \ldots \ldots \ldots$ |
| Number of Items: | $\cdots \ldots \ldots \ldots \ldots$ |
| Total Price: | $\cdots \ldots \ldots \ldots \ldots$ |
| Deposite Paid? | $\cdots \ldots \ldots \ldots \ldots$ |

what data type does each row belong to?

## Variables and Assignment Statements

- Variables are used in order to store and manipulate data. A variable is a named memory location that holds a value.
- Memory locations in RAM can used as a variable. Different types of data take up different amount of memory.
- For example, when you play a computer game a variable is created which holds your score at each point in time.
- An assignment statement is a line of code in which a variable is given a value. It has the general form
<variable> = <expression>
- Below variables on the left of = are assigned the values on the right of "=" sign

$$
\begin{aligned}
& \text { age }=29 \\
& \text { name }=\text { 'Fred' } \\
& \text { alive }=\text { True } \\
& \text { gpa }=3.9
\end{aligned}
$$

- Note that " $=$ " sign is called the assignment operator.


## Variable Names

## Names and Rules

By definition all variables must have a name. There are some rules governing this.

- Must start with a letter (or an underscore).
- Cannot start with a digit or be a keyword.
- Can have up to 256 total characters.
- Can include letters, digits, underscores, dollar signs, and other characters.
- Cannot contain spaces or maths symbols $(+,-, /, *, \%$, parentheses).
For example you can have numberOfFishInAquarium, but not 49 ers, table+chairs, my age, import, or (coins).

Python converts your code into a language of ones and zeros, when the compiler reads your code, it looks for special words called keywords to understand what your code is trying to say.

## Collection of Data

- Sometimes we would like to hold a collections of data items, sets/vectors of objects, rather than variables.
- This is done through various methods, Sequence, Sets, and Mapping types.
- These Sequence Operations (Methods), for example membership in and length len().


## Tuples

A tuple is an ordered sequence of zero or more object references. You can create a tuple by separating items with commas (and round brackets), for example,
t=("venus", -28, "gre", "21", 19.74, "-28")

- It is easy to extract items from a tuple, but we cannot replace or delete any of their items (immutable).
- The code $x$ in $t$ is a sequence operation which results in True if an item of $t$ is equal to $x$ and False otherwise.


## Sequence Types

## Exercise 2: Research and Find

Common sequence operations valid for tuples and write them with definition on https://www.menti.com/im5r1bitpb. Hint: You may use the Python Library Reference https://docs.python.org/3.

## Lists

A list is an ordered sequence of zero or more object references. You can create a list by separating items with commas and square brackets, for example,
L=[-17.5, "kilo", ("ram", 5, "echo"), 7]

- It is easy to extract items from a list, and we can replace and delete any of their items (mutable).
- It is also possible to insert, replace, and delete slices of lists.
- There are many methods for lists, e.g., L. append (x) appends item x to the end of list L .


## Sets Types

## Exercise 3: Research and Find

Methods (sequence operations) for mutable sequence types and write them with definition on https://www.menti.com/im5r1bitpb.

## Sets

A set is an unordered collection object references that refer to hashable ${ }^{a}$ objects. You can create a set by separating items with commas and curly brackets, for example,

$$
\begin{aligned}
& S=\{7, \text { "veil", 0, ("x", 11), frozenset([8, -4, 7]), } \\
& \text { "sun" }\}
\end{aligned}
$$

- Sets are mutable, so we can easily add or remove items.
- Since they are unordered, no notion of index position, and so cannot be sliced strided.
- Usual set operations: । union, \& intersection, - set difference, ^ symmetric difference.

[^2]
## Mapping Types

## Dictionaries

A dict is an unordered collection of zero or more key-value pairs whose keys are object references that refer to hashable objects, and whose values are object references referring to objects of any type. For example, if you want to keep data for a customer's Name: George, Age: 29, and Sex: Male, you can use

$$
\text { C=dict(\{"Name":"George", "Age":29, "Sex":"Male"\}) }
$$

- Dictionaries are mutable, so we can easily add or remove items
- They are unordered, like sets, so no notion of index position and cannot be sliced or strided.
- There are several ways of creating dictionaries.
- You can use the usual set operations.


## Logical Operations

- We can test objects for truth. For example, testing if x belongs to a set S or two objects are the same.
- By default, an object is considered True unless its class defines either a boolean method that returns False or a has length 0. Truth can be tested using bool().
- Some built-in objects considered false:
- Constants defined to be false: None and False.
- Zero of any numeric type: $0,0.0,0 j$, Decimal ( 0 ), Fraction(0, 1).
- Empty sequences and collections: '', (), [], set(), range (0).
- Testing for truth is important when using if or while statements (i.e., doing something if/while something is true).


## Logical Operators

Python has four types logical operators.

- The Boolean Operations are and, or, not; for example,

```
O or 1
"Ali" and 2
not 1
```

They word as follows
$x$ or $y \quad$ if $x$ is false, then $y$, else $x$
$x$ and $y$ if $x$ is false, then $x$, else $y$
not $\mathrm{x} \quad$ if x is false, then True, else False

- The Comparison operators are $<,<=,>,>=,==,!=$, is, is not.


## Exercise 4: Research

Find and discuss what each of the comparison operators mean.

Having understood the basics of Python, we can now start creating computer programmes.

## To Write a Programme We Need To

(1) Have a problem and we need to state it as clearly as possible.
(2) Determine what the input is, i.e., what information is given.
(3) Know how to solve the problem theoretically, by hand, and for simple examples.
(1) Decide what the output should be.
(6) Write the script that allows for the input, preforms calculation, and returns output.
(0) Test the script on several examples and check for efficiency.

## Example

## Problem

Write a programme which solves any quadratic equation with real coefficient and returns two solutions.

## Programme Steps 1, 2, 3, 4

(1) Find the solutions for any equation

$$
a x^{2}+b x+c=0 \text { where } a \neq 0
$$

(2) Input is real numbers $a, b, c$, with $a \neq 0$.
(3) Solve by hand

$$
\begin{aligned}
& a x^{2}+b x+c=0 \Longrightarrow x^{2}+\frac{b}{a} x+\frac{c}{a}=0 \Longrightarrow \\
& x^{2}+2 \frac{b}{2 a} x+\frac{b^{2}}{4 a^{2}}-\frac{b^{2}}{4 a^{2}}+\frac{c}{a}=0 \Longrightarrow\left(x+\frac{b}{2 a}\right)^{2}=\frac{b^{2}}{4 a^{2}}-\frac{c}{a} \\
& \Longrightarrow x-\frac{b}{2 a}= \pm \frac{\sqrt{b^{2}-4 a c}}{2 a} \Longrightarrow x_{1}=\frac{-b+\sqrt{b^{2}-4 a c}}{2 a}, x_{2}=\frac{-b-\sqrt{b^{2}-4 a c}}{2 a} .
\end{aligned}
$$

(1) Output should be $x_{1}$ and $x_{2}$.

## Example Cont. I Programme Step 5

Following is the first attempt at creating the script.

```
    # Input, you can change these and rerun.
    a=1;b=1;c=0
    # Here we do the calculations.
    import math # For taking square root
    # we need to import the package math
    delta=b**2-4*a*c
    firstSolution=(-b+math.sqrt(delta))/2*a
    secondSolution=(-b-math.sqrt(delta))/2*a
    # Use print function to display output
print("The first solution is", firstSolution, "and
    the second solution", secondSolution)
```


## Example Cont. II

## Programme Step 6

Test the script for following values and make sure you get the correct solution.

| Values | $a$ | $b$ | $c$ |
| :--- | :---: | :---: | :---: |
| 1 | 1 | 1 | 0 |
| 2 | 2 | 3 | 0 |
| 3 | 0.5 | 3 | 3 |
| 4 | 2 | 1 | 1 |
| 5 | $" x "$ | 1 | 1 |

Record any issues and find a way to fix them. Test more if necessary!

## Programme Steps 6 Cont.

1 Fine.
2 Returns The first solution is 0.0 and The second solution -6.0 , the correct solution is $x_{1}=0$ and $x_{2}=1.5$. Fix: in lines 8 and 9 of the code we need to have $2 *$ a in bracket, i.e., ( $2 *$ a).
3 Fine.
4 Returns error, here the solutions are imaginary, but math. sqrt cannot take the square root of an imaginary number. Fix: use the cmath in line 7 package together with cmath.sqrt in line 8 and 9 .
5 Returns error - correctly as the input is not a float number.

## Example Cont. IV Programme Final Version

Following is the second attempt at the script after testing.

```
# Input, you can change these and rerun.
a=1;b=1;c=0
# Here we do the calculations.
# For taking square root we need cmath
import cmath
delta=b**2-4*a*c
firstSolution=(-b+cmath.sqrt(delta))/(2*a)
secondSolution=(-b-cmath.sqrt(delta))/(2*a)
# Use print function to display output
print("The first solution is", firstSolution, "and the second
    solution is", secondSolution)
```

10

## Question

What if we wanted the programme to request for the input?

## Example Cont. IV: Alternative Script

## Programme Using input() Function.

```
# Start by input
a=float(input("Enter a Non-Zero Real Number for a:"))
# Use the input function to ask for a, b, c.
b=float(input("Enter a Real Number for b:"))
# It is useful to have type float,
c=float(input("Enter a Real Number for c:"))
# so upon entrance turn the input into float.
# Here we do the calculations.
import cmath # For taking square root
delta=b**2-4*a*c
firstSolution=(-b+cmath.sqrt(delta))/(2*a)
secondSolution=(-b-cmath.sqrt(delta))/(2*a)
# Finally use print function to display output
print("The first solution is", firstSolution, "and the second
    solution is", secondSolution)
```


## Exercise 5: Straight-Line Distance

Write a programme to compute the straight-line distance between two points in a plane up to 3 decimal places.


## Summary

What we did today...
Data Types
int, float, str, bool, complex, ...
Variables

Collection of Data
Assignment statement and rules

Logical and Comparison

First Programme

Next Time
State, input, solve, output, script, test
Conditional Statements and Loops

## Week 8

## Conditional Statements and Loops

```
a=int(input("Enter an integer"))
while a<10:
    for i in range(1,10,a):
        if i%3==0:
            print(i,"is divisible by 3")
        elif i%5!=0 and i%2!=0:
            print(i, "is not divisible by 5 and 2")
        else:
            print(i, "is not divisible by 3, but can be
        divisible by other primes")
    a=a+1
else:
    print("End of a complicated and very strange while, for,
    if statement!")
```


## Lecture Contents



Introduction

- Module Aims and Assessment
- Topics to be Covered
- Reading List and References

Week 5: Data and Visualisation with Excel

- What is Excel?
- Data Entry and Functions
- Visualisation Methods
- Tables and Pivots

Week 6: Introduction to Python 3

- What is Python?
- Installing and Running
- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpy

Week 7: Data Types, Methods, and
Programming

- Code and Data
- Data Types: int, str, bool, float, complex
- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

5
Week 8: Conditional Statements and Loops

O if, else, and elif Statements

- for and while Loops

O break and continue Statements

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda


Week 10: Matrices. Dataframes, and Data Manipulation

- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()
(8)

Week 11: Statistics and Visualisation
Methods

- Statistics with scipy
- Plotting with matplotlib
- Interactive Plots with plotly

Week 12: Numerical Algorithms

- Introduction to Numerical Analysis
- Roots of Nonlinear Equations
- The Bisection Method
- Error for Bisection Method


## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Learn to uses conditional statements and loops.
(2) Construct control flows using if, else, and elif statements.
(3) Create loops using for and while.
(1) Understand how to use break and continue statements.

## Introduction

- Last week we create programmes where individual commands would be executed line after line.

- This week we will be looking at diverting control, e.g., "If today is Monday, then I will go to work", or "while I am hungry, I will eat".
- There are two main ways of doing this:
- Conditional statements with if, else, and elif using bool data types, e.g., Comparison and Logical Operators.
- Loops with for and while using range, list, and bool.
- Flow charts, representation of all the possible paths through a process, are used to visualise conditional statements and loops.


## if statement

The if statement is used to divert a flow depending on a bool type data, i.e., depending on True or False preform different actions.


## Python Simple if Statement

The general expression for if statement is as follows.

```
if <Boolean expression>: # True/False
    # condition followed by colon
<indented block of code>
# Any number of indented lines
```

```
# Example 1
Cond=True # Statment
if Cond: # True condition
    print("Condition was", Cond)
# Example 2
x=float(input("Enter a number")) # Statment
if x>=0: # True/False condition
    print(x, "is a non-negative number")
    print(x, "plus 10 is equal to", x+10)
```


## Simple if Statement

## Exercise 1:

(1) Create variables which keeps the score for each of you and your friend in a game. Write a code which prints
I Win
if your score is higher than your friend's.
(2) Write a code takes a number $x$ and if it is non-zero it prints
A non-zero number
also returns $1 / x$.
(3) Write a code takes a number $x$ check if it is odd, prints

## Odd number

for odd numbers checks if $x^{3}$ is greater than 100 prints

> A large number
and returns $\ln (x)$ for these. Hint: you may need to use if statement within another if statement, nested statements.

## if and else Statements

In many occasions you may need to preform two operations depending on a condition being true or false.


## Python if and else Statements

The general expression for if and else statement is as follows.

```
if <Boolean expression>: # True/False
    # condition followed by colon
    <indented block of code>
    # some number of indented lines
else: # else followed by colon
    <indented block of code>
    # other number of indented lines
```

```
# Example
Cond=input("Choose True or False") # Statment
if Cond: # True condition
    print("Condition you chose was", Cond)
else:
    print("Condition you chose was", Cond)
```


## if and elif Statements

Sometimes we have more than two operations to preform. In this case we use elif statements.

```
if <Boolean expression>: # True/False
    # condition followed by colon
    <indented block of code>
    # some number of indented lines
elif <Boolean expression>:
    # else if followed by colon
    <indented block of code>
    # other number of indented lines
elif <Boolean expression>:
    # more else if followed by colon
    <indented block of code>
    # more number of indented lines
# as many elif as you may need....
else:
    <indented block of code>
    # default number of indented lines
```


## Example if and elif Statements

A code which classifies your degree type according to the final mark.

```
mark=float(input("Enter final mark"))
if mark>=70:
    print("First Class")
elif mark>=60:
    print("2.1")
    print("Mark is", 70-mark, "away from a first")
elif mark>=50:
    print("2.2")
elif mark>=40:
    print("Pass")
else:
    print("May need to resit some modules.")
```


## if and elif Statements

## Exercise 2:

(1) Write a code which asks for the age of the universe and if the correct answer is provided prints

Correct, Well done!
and if the wrong answer is provided prints
Unfortunately that is incorrect!
(2) Write a code which asks for temperature and rainy/sunny and prints the following.
If temperature is greater than 20 and sunny
Nice and worm day.
If temperature is greater than 10 and sunny
Sunny but chilly.
If temperature is greater than 20 and rainy
worn but rainy.
Otherwise Good luck with the weather today!

## for Loop

A for loop changes the flow to repeat a statement for each item in a given sequence.


## Python for Statements

The general expression for for statement is as follows.

```
for var in collectiontype: # for with
    # range/tuple/list/set followed by colon
    <indented block of code> # some number of
    # indented lines to be
    # preformed for each item
```

\# Example 1
for i in range $(2,20,3)$ :
print(i)
print(i, "squared is", i*i)
\# Example 2
for i in "Kayvan":
print(i)
\# Example 3
for i in ("1", "sunny", "day", "2.16"):
print(len(i))

## while Loop

A while loop changes the flow to repeat a statement while a condition is True. You can also use else with a while loop.


## Python while Statements

The general expression for while statement is as follows.

```
while <Boolean expression>: # True/False
    # condition followed by colon
    <indented block of code> # some number of
    # indented lines to be preformed until
    # Boolean condition is false
```

```
# Example 1
a=float(input("Enter a number"))
while a<=10:
    print(a); a+=1
# Example 2
a=input("Enter the lecturer's name for MATH1166")
while a!="Kayvan":
    a=input("Enter another guess")
else:
    print("You have guessed correctly!")
```


## for and while Loops

## Exercise 3:

(1) Write a for loop to print the type of each element in T=(-17.5, "kilo", "ram", 5, ["echo", 7])
(2) Write a for loop to double the elements which are divisible by 5 and positive in
$\mathrm{L}=[0,5,1,3,4,8,7,13,-15,12,10]$
(3) Write a while loop which computes the product of first 50 integers, i.e.,

$$
1 \times 2 \times \cdots \times 50
$$

(1) Write a for loop instead of while loop for above.
(6) Write a code which prints all strings and their length in L=[-17.5, "kilo", "ram", 5, ("echo", 7)]

## break Statements

The statement break can be used to immediately transfer to the first statement past the last line of the loop. The code

```
while True:
    <statement(s)>
```

runs for ever! It can be stopped using break. For example,

```
while True: # loop forever
    line = input("Type anything, type 'done' to exit: "
    )
    if line == 'done':
        break # transfers control out of the loop
    print("You entered:", line)
print("Finished")
```


## continue Statements

The continue statement continues with the next iteration of the loop.

```
for num in range(2, 10):
    if num % 2 == 0:
    print("Found an even number", num)
    continue # Go back to the loop
    print("Found a number", num)
```

which can be used to reduce unnecessary printing.

What we did today...
Flows Conditional Statements


## Week 9

## Built-in and User-Defined Functions



## Lecture Contents



Introduction

- Module Aims and Assessment
- Topics to be Covered
- Reading List and References

Week 5: Data and Visualisation with Excel

- What is Excel?
- Data Entry and Functions
- Visualisation Methods
- Tables and Pivots
(3)

Week 6: Introduction to Python 3

- What is Python?
- Installing and Running
- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpy
(4)

Week 7: Data Types, Methods, and
Programming

- Code and Data

Data Types: int, str, bool, float, complex

- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

Week 8: Conditional Statements and Loops
if, else, and elif Statements

- for and while Loops
- break and continue Statements

6 Week 9: Built-in and User-Defined Functions

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda


## Week 10: Matrices, Dataframes, and Data

 Manipulation- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()

Week 11: Statistics and Visualisation
Methods

- Statistics with scipy
- Plotting with matplotlib
- Interactive Plots with plotly

Week 12: Numerical Algorithms

- Introduction to Numerical Analysis
- Roots of Nonlinear Equations
- The Bisection Method
- Error for Bisection Method


## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Learn about functions and how they operate in Python.
(2) Use the built-in functions.
(3) Create user-defined functions.

## Functions in Mathematics

Much of mathematics is concerned with the study of functions, this is due to the fact that they have some much applications is real life!

## Question

What is a function?

## Definition (Function)

Let $X$ and $Y$ be sets. A function from $X$ to $Y$ is a rule that assigns to each $x \in X$ a single element of $T$, denoted by $f(x)$. We write

$$
f: X \longrightarrow Y
$$

to mean that $f$ is a function from $X$ to $Y$. If $f(x)=y$, we often say $f$ sends $x \mapsto y$.

## Functions: Domain, Range, Image

The set $X$ is known as the domain and $Y$ the range.


The elements of $Y$ which can be reached by applying $f$ to elements of $X$ for a set called the image of $f$. That is

$$
\operatorname{Im} f=f(X)=\{f(x) \mid x \in X\}
$$

For example,

$$
\begin{aligned}
f: \mathbb{R} & \longrightarrow \mathbb{R} \\
x & \mapsto x^{2} .
\end{aligned}
$$

## Functions in Programming

A function diverts the follow once called.


Kayvan Nejabati Zenouz

## Built-in Functions

- We have seen the built-in operators in Python

$$
+,-, *, /, * *, / /, \%,<,>, \cdots
$$

- Similarly Python comes with a number of built-in functions.
- Using a function is known as calling a function. Here's what a generic call to a function with arguments looks like:

```
<functionName>(<argument1>, <argument2>, ...)
```

- A function can have zero or any number of input variables as well as default values.
- We have worked with many other functions already print() input(), type(), bool(), int(), string(), float(), tuple(), dict() pow(), complex(), frozenset(), ...
- If you need a function which does not exit in Python already, you can define your own function.


## Arguments in Built-in Functions

- Some functions accept a number of propositional arguments.
- We have already used print(), whose input can be a number of variables.

```
print("Hello, World", "Today I am", 22, sep=" - ", end=
    " ")
```

- The print() function has three key word arguments: sep, end, and file.
- The sep parameter's default is a space; if two or more positional arguments are given, each is printed with the sep in between.
- The end parameter's default is $\backslash \mathrm{n}$, which is why a newline is printed at the end of calls to print().
- The file parameter's default is sys.stdout, the standard output stream, which is usually the console.


## User-Defined Functions

You can define a function using the general expression.

```
def functionName(parameter1, parameter2,...):
    # def with function name, a number of
    # inputs followed by colon
    <indented block of code> # some number of
    # indented lines to be
    # preformed on the inputs
```

```
# Example 1
def hello(): # name of the function and no input
    print("Hello, World!") # Prints "Hello, World"
# Example 2
def powerAddFun(x,y=2): # has two input x and y
    # Defualt value for y is 2
    return pow(x,y), x+y # Return a tuple output
```

Call by hello(), powerAddFun(2,3), or powerAddFun(2).

## Functional Compositions

- You can compose functions, i.e., apply one after the other.

```
age=20 # Composition of
print(type(age)) # Compose print() and type()
```

- You can write functions that apply to collection types.

```
def enumerate(sequence, start=0): # Number
    n = start # elements in a collection type
    for elem in sequence:
    yield n, elem
        n += 1
```

- You can use conditional statements and loops in functions.

```
def all(iterable): # Decide if elements
    for element in iterable: # in a collection
        if not element: # type are True
            return False
    return True
```


## Exercise 1: Functions

(1) Write a function that returns

$$
x^{2}+x-2
$$

for a given $x$. Apply your function to range $(1,10)$.
(2) Write a function which has inputs height, in meters, weight in kilo, and returns BMI. Recall

$$
\text { BMI }=\frac{\text { weight }}{\text { height }^{2}} .
$$

(3) Write a function which has no input, but once called asks for a name and prints
....(name) will be a great mathematician!
(1) Write a function that calculates the mean of all numbers in a collection type.

## Python Anonymous Functions lambda

- A lambda function is a small anonymous function.
- It can have any number of inputs, but only one expression

```
functionName = lambda arguments : expression
```

- For example,

```
powerFunLambda = lambda x,y : pow(x,y)
```

- The power of lambda is better shown when you use them as an anonymous function inside another function.

```
def myFunc(n): # for each n
    return lambda a : a * n # create a lambda
myDoubler = myFunc(2) # returns a --> 2*a
myDoubler(11) # returns 2*11
```


## Summary

What we did today...
Functions
Assignments between two sets
Built-in Functions

User-Defined Functions

Python Lambda
Next Time
lambda arguments : expression

Matrices and Data Manipulation

## Week 10 Matrices and Data Manipulation

from sympy import * \# import sympy
M = Matrix ([ [1, 0, 1, 3] ,

$$
\begin{aligned}
& {[2,3,4,7],} \\
& [-1,-3,-3,-4]])
\end{aligned}
$$

M_rref = M.rref() \# Use sympy.rref() method print("The Row echelon form of matrix M and the pivot columns : \{\}".format(M_rref))
The Row Reduced Echelon Form of matrix $M$ and the pivot columns: (Matrix([

$$
\begin{aligned}
& {[1,0,1,3] \text {, }} \\
& \text { [0, 1, 2/3, 1/3], } \\
& [0,0,0,0]]),(0,1))
\end{aligned}
$$

## Lecture Contents



Introduction

- Module Aims and Assessment
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- Reading List and References

Week 5: Data and Visualisation with Excel

- What is Excel?
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- Tables and Pivots
(3)

Week 6: Introduction to Python 3

- What is Python?
- Installing and Running
- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpy
(4)

Week 7: Data Types, Methods, and
Programming

- Code and Data
- Data Types: int, str, bool, float, complex
- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

Week 8: Conditional Statements and Loops
if, else, and elif Statements

- for and while Loops
- break and continue Statements

Week 9: Built-in and User-Defined Functions

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda

Week 10: Matrices, Dataframes, and Data Manipulation

- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()


# Week 11: Statistics and Visualisation 

Methods

- Statistics with scipy
- Plotting with matplotlib
- Interactive Plots with plotly

Week 12: Numerical Algorithms

- Introduction to Numerical Analysis
- Roots of Nonlinear Equations
- The Bisection Method
- Error for Bisection Method


## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Know how to create vectors and matrices with numpy and sympy.
(2) Preform linear algebra operations, symbolic manipulations, and number theoretic calculations.
(3) Create/manipulate dataframes and load data with pandas.
(1) Produce summary tables and visualisation from data.

## Introduction

- So far we have learnt all basics of programming:
- Basic calculations and operations.
- Data types, manipulation of collection types.
- Conditional statements and Loops.
- Use defined and built-in functions.
- Creating programmes to solve problems.
- We can now look at advanced usage of Python for
- linear algebra and number theory,
- statistics and data analysis,
- plotting/visualisation, and
- sophisticated mathematical problems.
- Libraries numpy and sympy are used for creating and manipulating matrices as well as symbolic mathematics.
- The library pandas is used for loading and analysis of data into Python.


## Package with numpy and sympy

- For calculation that are repeated for a set of input values, it is useful to store data as arrays and computation in terms of array: vectorisation.
- The package NumPy provides efficient functions for manipulating and processing arrays.
- NumPy arrays bear some resemblance to Python's list data structure.

```
import numpy # You can use: import numpy as np
V=[1,2,3,4] # list
Vn=numpy.array([1,2,3,4]) # A numpy array
```

- However, NumPy arrays are homogeneous with fixed size.
- homogeneous: all elements in the array have the same data type. Fixed size means that an array cannot be resized.
- You can preform linear algebra operations with NumPy arrays.


## Arrays with Library numpy

Easiest way to create arrays, i.e., vectors and matrices is through lists within a list.

- The code

V=numpy.array([1,2,3,4]) \# A row numpy array
creates a row vector say

$$
V=\left(\begin{array}{llll}
1 & 2 & 3 & 4
\end{array}\right) .
$$

- However, the code

V=numpy.array ([[1],
[2] ,
[3],
[4]]) \# A column numpy array
create the column vector $V=\left(\begin{array}{l}1 \\ 2 \\ 3 \\ 4\end{array}\right)$.

## Matrices, Tensors, and Attributes

## Matrices

To create a matrix use lists with a list. The code

$$
\begin{aligned}
A=\text { numpy } \cdot \operatorname{array}( & {\left[\begin{array}{ll}
{[1,2,3],} \\
& {[0,1,0],} \\
& {[3,7,13],} \\
& [0.1,0,0.1]])
\end{array}\right.}
\end{aligned}
$$

creates the matrix

$$
A=\left(\begin{array}{ccc}
1 & 2 & 3 \\
0 & 1 & 0 \\
3 & 7 & 13 \\
0.1 & 0 & 0.1
\end{array}\right)
$$

Create multidimensional arrays, tensors, with types
At=numpy .array ([[[1, 2], [2, 3]],
$[[0,1],[1,0]]$,
[ [3, 7], [13, 17] ]], dtype=complex)
The functions used to find the basic attributes of arrays
type (At), At.shape, At.size, At.ndim, At.dtype (numpy.ndarray, (3, 2, 2), 12, 3, dtype('complex128'))

Change data types use astype(); for example,
A.astype(numpy.int)
$\operatorname{array}\left(\left[\begin{array}{ll}1, & 2,3] \text {, }\end{array}\right.\right.$
$[0,1,0]$,
[ 3, 7, 13],
$[0,0,0]])$

## Creating Arrays

There are several functions, alongside numpy. array (), which allow you to create arrays according to patters.

| Function | Definition |
| :--- | :--- |
| numpy.zeros $((\mathrm{m}, \mathrm{n}))$ | $m$ rows and $n$ columns of zeros |
| numpy.ones $(\mathrm{m}, \mathrm{n}))$ | $m$ rows and $n$ columns of ones |
| numpy.arange $(\mathrm{n})$ | array containing $0, \ldots, n-1$ |
| numpy.random.rand $(\mathrm{n})$ | array containing $n$ random numbers |
| numpy.linspace $(\mathrm{a}, \mathrm{b}, \mathrm{s})$ | from $a$ to $b$ in $s$ steps |
| numpy.eye $(\mathrm{n}, \mathrm{k}=\mathrm{r})$ | $n \times n$ identity matrix shifted by $r$ |
| numpy.diag $(\mathrm{L})$ | zero matrix with $L$ on the diagonal |
| numpy.meshgrid (L, S$)$ | mesh of arrays $L$ and $S$ |

You can apply numpy functions to arrays, e.g., numpy. log (numpy. linspace ( $1,10,10$ )).
Some functions: numpy.cos, numpy.sin, numpy.tan, numpy.arccos, numpy.arcsin, numpy.cosh, numpy.sinh, numpy.tanh, numpy.sqrt, numpy.exp, numpy.log.

## Indexing, Slicing, Shaping

Indexing and slicing are done using similar rules for lists. For example, for vectors

$$
a[n: m: p] \text { \# Take elements from } n \text { to } m \text { in steps of } p
$$

For matrices we can separate row and column by commas

```
A[m,n] # Take element in row m column n
A[1,:] # Take second row
A[:,1] # Take second column
A[:2, :2] # upper half diagonal block matrix
A[::2, ::2] # every second element starting from
0,0
```

Make comparison and subset accordingly

```
a > 5 # boolean comparison for elements > 5
a[a > 5] # Take elements > 5
A[A != 0] # Take nonzero elements
```

Reshape vectors: reshape( $n, m$ ), flatten(), transpose(), numpy.hstack(), numpy.vstack(), numpy.append (a, x),

## Basic Operations

- The standard arithmetic operations with arrays perform elementwise.

```
x = numpy.array([[1, 2], [3, 4]])
y = numpy.array([[5, 6], [7, 8]])
x*y
array([[ 5, 12],
    [21, 32]])
```

- Comparisons are preformed componentwise

```
x<y
array([[ True, True],
    [ True, True]])
```

- There are also several aggregate functions: numpy.mean, numpy.std, numpy.var, numpy.sum, numpy.prod, numpy.cumsum, numpy.cumprod, numpy.min, numpy.max, numpy.argmin, numpy.argmax, numpy.all, numpy.any.


## Linear Algebra

There are several functions for linear algebra operations.

| Function | Definition |
| :---: | :---: |
| a+b, a-b, k*a | addition/subtraction, scalar |
| A.transpose() | transpose of $A$ |
| numpy.dot (a,b) | dot product and multiplication |
| numpy.cross (a, b) | cross product for 2/3-D |
| numpy .matmul (A, B) | multiplication |
| numpy.linalg.matrix_power (B,n) | raise matrix $B$ a power $n$ |
| numpy.linalg.det(A) | determinant of $A$ |
| numpy.linalg.inv(A) | inverse of $A$ |
| numpy.linalg.solve(A, b) | solve $A x=b$ |
| numpy.linalg.eigvals(A) | eigenvalues of $A$ |
| numpy.linalg.eig(A) | eigenvalues/vectors of $A$ |
| numpy.linalg.norm(A) | matrix or vector norm |

Functions offered by NumPy and SymPy (see next slide) can be used to make many computations for concepts you learn in MATH1167 Techniques of Calculus and Linear Algebra.

## Matrices with sympy

- You can use the symbolic mathematics library sympy for some matrix manipulations.
- The code

$$
\begin{aligned}
M=\text { sympy } \cdot \operatorname{Matrix}( & {[[1,0,1],} \\
& {[2,3,4], } \\
& {[-1,-3,-3]]) }
\end{aligned}
$$

creates the matrix

$$
M=\left(\begin{array}{ccc}
1 & 0 & 1 \\
2 & 3 & 4 \\
-1 & -3 & -3
\end{array}\right)
$$

- Some functions on matrices are M. shape, M.row(m), M.col(n), M+N, M*N, M**-1, M.det(), M.rref(), M.eigenvals(), M.eigenvects(), M.diagonalise(), M.nullspace().


## Exercise 1: Vectors and Matrices

(1) Create the following vectors and matrices, using NumPy,

$$
A=\left(\begin{array}{lll}
1 & 0 & 1 \\
2 & 3 & 4
\end{array}\right), u=5 i+12 j, v=i+2 j-2 k,
$$

where $i, j, k$ are the standard unit vectors.
(2) Extract the matrix

$$
\left(\begin{array}{ll}
1 & 1 \\
2 & 4
\end{array}\right)
$$

from $A$.
(3) Extract the third column of $A$.
(1) Find the following.

$$
\begin{aligned}
& u+v, u \cdot v, u \times v,|u|, \widehat{v} \\
& A^{T}, A u, A A^{T}, \operatorname{det} A^{T} A .
\end{aligned}
$$

(6) Find the eigenvalues and eigenvectors of $A A^{T}$.
(6) Find the reduced echelon form of $A$.

## Symbolic Mathematics

- You can define symbols using function of sympy and preform many mathematical operations.

```
# declare symbols
a, b, c, d = sympy.symbols("a, b, c, d")
x, y, z, t = sympy.symbols("x, y, z, t")
M = sympy.Matrix([[a, b], # define matrices
    [c, d]]) # in terms of
    symbols
N = sympy.Matrix([[x, y],
    [z, t]])
M*N # * is matrix multiplication in sympy
```

- Have symbolic versions of quantities and expressions

```
sympy.pi
sympy.sqrt(27)
expr=sympy.exp((x+y)**2)
```

- Evaluate using evalf(), e.g, sympy.sqrt(27).evalf(5).


## Symbols and Calculus sympy Functions

| Function | Definition |
| :---: | :---: |
| sympy.symbol("x,y,z") | define symbols |
| sympy.exp(), sympy.sqrt() | usual functions |
| sympy. Lambda ( $\mathrm{x}, \mathrm{x} * * 2$ ) | lambda functions |
| sympy.expand(expr), sympy.factor (expr) | expand/factor expr |
| expr.subs(\{x:a,y:b\}) | substitute $x=a$ and $y=b$ |
| sympy.Eq(x+y,4) | define equation $x+y=4$ |
| sympy.simplify (expr) | simplify expr |
| sympy.diff (sympy .exp (x**2) , x, 2) | differentiate $e^{x^{2}}$ twice |
| sympy.Derivative (sympy .exp ( $(\mathrm{x}+\mathrm{y}) * * 2), \mathrm{x}, \mathrm{y})$ | derivative $\frac{\partial^{2}}{\partial x \partial y} e^{(x+y)^{2}}$ |
| sympy.integrate( $\mathrm{x} * * 3,(\mathrm{x}, \mathrm{a}, \mathrm{b})$ ) | integral $\int_{a}^{b} x^{3} \mathrm{~d} x$ |
| sympy.Integral ( $\mathrm{x} * * 3, \mathrm{x}$ ) | integral $\int x^{3} \mathrm{~d} x$ |
| sympy.Integral ( $\mathrm{x} * * 3, \mathrm{x}$ ) $\cdot$ doit () | compute $\int x^{3} \mathrm{~d} x$ |
| sympy. $\mathrm{limit}(\operatorname{sympy} \cdot \sin (\mathrm{x}) / \mathrm{x}, \mathrm{x}, 0$ ) | $\lim _{x \rightarrow 0} \frac{\sin x}{x}$ |
| sympy.solveset (sympy.Eq (x**2,-1), x) | solve $x^{2}+1=0$ |
| sympy.Sum(1/x**2, (x, 1, sympy.oo)).doit () | $\text { evaluate } \sum_{x=1}^{\infty} \frac{1}{x^{2}}$ |

## Number Theory sympy Functions

The library SymPy also offers many number theoretic functions.

| Function | Definition |
| :--- | :--- |
| sympy.isprime( n ) | True is $n$ is prime |
| sympy.primerange(m, n ) | primes $p$ between $m \leq p<n-1$ |
| sympy.randprime(m, n ) | random prime $p$ between $m \leq p<n-1$ |
| sympy.primepi( n ) | Number of primes $p \leq n$ |
| sympy.prime( n ) | the $n^{\text {th }}$ prime |
| sympy.primefactors( n$)$ | prime factors of $n$ |
| sympy.divisor_count( n$)$ | number of divisors of $n$ |
| sympy.factorint( n$)$ | factorisation of $n$ |

These can be used in computations for concepts you learn in MATH1172 Vector Calculus and Number Theory during your second year.

## Data Manipulation with pandas

- In many case we have dataframes or .csv files which needs to be analysed as arrays in Python.
- Easy-to-use data structures and data analysis tools pandas library is used for dealing with such cases.
- A dataframe is a two-dimensional array with labelled axes. You can create dataframe using pandas.
df = pandas.DataFrame (\{
'A': numpy.linspace $(0,2,8) * * 2$,
'B': pandas.date_range('20130101', periods=8),
'C': pandas.Series(range(8), dtype='float32'),
'D': numpy.array([1,3] * 4, dtype='int32'),
'E': pandas.Categorical(["train", "train", "test", "train"]*2),
'F': ['foo','goo']*4,
'G': numpy.random.randn(8)\}, index=list(range(8)))
df.name= "Mydata"
is a dataframe with 8 rows and 7 columns.


## Dataframes

- The code produces the following dataframe.

| $\mathbf{A}$ | $\mathbf{B}$ | $\mathbf{C}$ | $\mathbf{D}$ | $\mathbf{E}$ | $\mathbf{F}$ | $\mathbf{G}$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 0.000000 | $2013-01-01$ | 0.0 | 1 | train | foo | -0.947895 |
| 0.081633 | $2013-01-02$ | 1.0 | 3 | train | goo | 0.841866 |
| 0.326531 | $2013-01-03$ | 2.0 | 1 | test | foo | 0.310235 |
| 0.734694 | $2013-01-04$ | 3.0 | 3 | train | goo | 0.171024 |
| 1.306122 | $2013-01-05$ | 4.0 | 1 | train | foo | -0.759685 |
| 2.040816 | $2013-01-06$ | 5.0 | 3 | train | goo | 0.141803 |
| 2.938776 | $2013-01-07$ | 6.0 | 1 | test | foo | 0.604985 |
| 4.000000 | $2013-01-08$ | 7.0 | 3 | train | goo | -0.300757 |

- Attributes of dataframe can be found using df.index, df.columns, df.dtypes, df.describe(), df.median(), df.mean(), df.std().
- Indexing and slicing can be preformed through, for example, df["A"], df.A[2:], df.loc[1:5,["A", "B"]], df[(df.E == "train") \& (df.G > 0)], df.sort_index(axis=1, ascending=False).


## Grouping and Plots

- Grouping and pivoting can be done through
df.groupby(['E', 'F']).sum()
pandas.pivot_table(df, values='A',
index=['E', 'F'], columns=['D'])
- Summary plots

$$
\begin{aligned}
& \text { df.plot( } y=[" G ", " A "], x=" B ", \text { kind='line', title=' } \\
& \text { Line Plot') } \\
& \text { df.plot ( } y=[" G ", " A "], x=" B ", \text { kind='bar', title='Bar } \\
& \quad \text { Plot') } \\
& \text { df.plot (y=["G","A"], x="B", kind='box', title='Box } \\
& \quad \text { Plot') } \\
& \text { df.plot.scatter( } y=" A ", x=" C ", ~ c=' G ', ~ t i t l e=' ~ \\
& \text { Scatter Plot') }
\end{aligned}
$$

- Transpose data df.T or turn into NumPy object df.to_numpy().
- To import a .csv file use pandas.read_excel().


## Summary

What we did today...
NumPy arrays and Matrices

Linear Algbera

SymPy and Symbolic

Data with Pandas

Next Time
numpy.array(), functions, and attributes
numpy.dot(), numpy.linalg.det()
sympy.symbols("x, y, z"), calculus, number theory
pandas.DataFrame(), visualisation, pandas.read_excel()
Statistics and Visualisation Methods

## Week 11 <br> Statistics and Visualisation Methods

Elliptic Curve $y^{2}=x^{3}-x+1$


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Introduction

- Module Aims and Assessment
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Week 5: Data and Visualisation with Excel

- What is Excel?
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- Visualisation Methods
- Tables and Pivots

Week 6: Introduction to Python 3

- What is Python?
- Installing and Running
- Basic Programming and Mathematics
- Interfaces for Python: IDLE, Jupyter, Spyder
- Packages: math, cmath, numpy

Week 7: Data Types, Methods, and
Programming

- Code and Data
- Data Types: int, str, bool, float, complex
- Variables and Assignments
- Collection of Data: tuple, list, set, dict
- Logical and Comparison Operations
- First Programme

Week 8: Conditional Statements and Loops
if, else, and elif Statements

- for and while Loops
- break and continue Statements

Week 9: Built-in and User-Defined Functions

- Functions in Mathematics
- Built-in Functions
- User-Defined Functions
- Python Anonymous Functions lambda

Week 10: Matrices, Dataframes, and Data Manipulation

- Matrices with numpy and sympy
- Linear Algebra, Symbolic Mathematics, Calculus, and Number Theory with sympy
- Data Manipulation and Visualisation with pandas
- Import Data pandas.read_excel()
(8) Week 11: Statistics and Visualisation Methods
- Statistics with scipy
- Plotting with matplotlib
- Interactive Plots with plotly

Week 12: Numerical Aigorithms

- Introduction to Numerical Analysis
- Roots of Nonlinear Equations
- The Bisection Method
- Error for Bisection Method


## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Use the statistical capabilities of Python with scipy.
(2) Make plots and different visualisations with matplotlib.
(3) Create interactive plots with plotly.

## Introduction

## SciPy Scientific

The library scipy is a collection of mathematical algorithms built on NumPy. It offers many features including

- statistical functions,
- integration and differential equation solvers,
- interpolation,
- signal processing, and many others.


## Matplotlib Graphics

The library matplotlib is 2-D plotting library which produces high quality figures.

## Plotly's Interactive

The library plotly makes interactive, publication-quality graph and animations.

## Statistics with scipy

- The stats component of scipy allows for implementation of combinatorial functions and random variables.
- It includes special functions:
- scipy.special.factorial(n) for $n$ !
- scipy.special.comb(n, k) for

$$
\binom{n}{k}=\frac{n!}{k!(n-k)!}
$$

- scipy.special.comb(n, k, repetition=True) for

$$
\frac{(k+n-1)!}{k!(n-1)!}
$$

- scipy.special.perm(n, k) for

$$
\frac{n!}{(n-k)!}
$$

- These can be used in computations for concepts you learn in STAT1040 Probability and Statistical Inference.


## Random Variables in scipy

## Continuous

- stats.norm.rvs(loc=mu, scale=sigma, size=k) generates k samples form normal distribution $\mathcal{N}(\mu, \sigma)$.
- Related functions include stats.norm.pdf, stats.norm.cdf, stats.norm.ppf, stats.norm.moment, stats.norm.stats, stats.describe.
- Includes stats.expon.rvs, stats.gamma.rvs, stats.chi.rvs


## Discrete

- stats.binom.rvs(n, p, size=k) generates k samples form normal distribution $\operatorname{Bin}(n, p)$.
- Related functions include stats.norm.pmf, stats.norm.cdf, stats.describe.
- stats.bernoulli.rvs, stats.poisson.rvs, stats.geom.rvs.


## Plotting with matplotlib

- Matplotlib is widely used for plotting in Python.
- At the top of the hierarchy is the matplotlib "state-machine environment" which is provided by the matplotlib.pyplot module (it is often used with NumPy). import matplotlib.pyplot as plt import numpy as np
- At this level, simple functions are used to add plot elements.

```
x = np.linspace(0, 2, 100)
plt.plot(x, x, label='linear')
plt.plot(x, x**2, label='quadratic')
plt.plot(x, x**3, label='cubic')
plt.xlabel('x label')
plt.ylabel('y label')
plt.title("Simple Plot")
plt.legend()
plt.show()
```


## Plot Options with matplotlib

You can plot a list, Numpy arrays, or other collections types and customise the appearance.
$\mathrm{x}=[1,3,5,9,9,2,3,4,9,10]$; $\mathrm{y}=\mathrm{np} . \operatorname{linspace}(0,3,10) * * 2$
plt.plot(x, color='blue', marker='*',
linestyle='solid', linewidth=2, markersize=10,
label="x vs index", alpha=0.2) \# First plot plt.plot(x, y, color='red', marker='o',
linestyle='dashed', linewidth=2, markersize=8,
label="x vs y", alpha=0.8) \# Second plot plt.ylabel("Y"); plt.xlabel("X") \# Axes labels plt.title("Two Plots") \# Title for Plot plt.legend(loc=9) \# Show legend locations 1,..., 10 plt.annotate('Local Max', $x y=(3,9), x y t e x t=(0,10)$,
arrowprops=dict(facecolor='black', shrink=0.05)) plt.axis([-1, 11, -1, 12]) \# Axes limits plt.grid(True); plt.show() \# Show grid and plot

## More on matplotlib

You can produce scatter, line, box, bar, 3-D, and many other plots. Produce several plots in one figure.

```
years = [1950, 1960, 1970, 1980, 1990, 2000, 2010]
gdp = [300, 543, 1075, 2862, 5979, 10289, 14958]
debt = [100, 1200, 800, 1100, 6000, 15000, 11000]
fig, ((ax1, ax2, ax3, ax4), (ax5, ax6, ax7, ax8)) = plt.
    subplots(2,4, figsize=(15,10))
ax1.plot(years, gdp, color='g', marker='0')
ax2.step(years, gdp, color='r')
ax3.bar(years, gdp, color='b')
ax4.hist(gdp, color='m')
ax5.errorbar(years, gdp, debt, color='k')
ax6.scatter(years, gdp, color='c', marker='*')
ax7.fill_between(years, gdp, debt, color='y')
ax8.boxplot(debt)
plt.tight_layout(pad=0.4, w_pad=0.5, h_pad=1.0)
plt.show()
```


## Interactive Plots with plotly

## Matplotlib is now old and boring!

## Plotly

- Modern library which allows for interactivity and creation of animations.
- You can use either Plotly Express, for quick graphs, or Plotly Graphics Objects, for advanced usage.

You can create a line, bar, box, and many others using plotly.express library.

```
import plotly.express as px
fig = px.line(x=years, y=gdp,
    labels={'x':'Years', 'y':'Billions of Dollars'},
    title='Nominal GDP')
fig.show()
```


## Graphics Objects

For more customisation use plotly.graph_objects library.
import plotly.graph_objects as go
fig = go.Figure(data=go.Scatter (x=years, $y=g d p$,
mode='lines+markers'))
fig.update_layout(title='Nominal GDP')
fig.update_xaxes(title_text='Years')
fig. update_yaxes(title_text='Billions of Dollars') fig.show()
$\mathrm{x}=\mathrm{np} . \operatorname{linspace(0,~2,~20);~fig~=~go.Figure()~}$
fig.add_trace(go.Scatter(x=x, $y=x$, mode='markers', name='markers')) \# Add traces
fig.add_trace(go.Scatter (x=x, $y=x * * 2$, mode='lines+markers', name='lines+markers'))
fig.add_trace(go.Scatter( $\mathrm{x}=\mathrm{x}, \mathrm{y}=\mathrm{x} * * 3$, mode='lines', name='lines'))
fig.update_layout(title='Simple Plot'); fig.show()

What we did today...
SciPy

Basic Plotting
Statistics and special functions
matplotlib.pyplot
Advanced Interactivity

Next Time

plotly.express, plotly.
graph_objects
Numercial Methods

## Week 12 <br> Numerical Algorithms

```
# Fixed point method to find zeros of f(x)=x-\operatorname{cos}(x)
import math
f = lambda x: x-math.cos(x)
g = lambda x: math.cos(x)
x=[0.1]
err=[f(x[0])]
NofIt=50
tolorance=0.0005
for i in range(NofIt):
    x.append(g(x[i]))
    err.append(x[i+1]-x[i])
    if abs(err[i+1]) < tolorance:
        print("Number of Iterations", i+1, "Final x is",
        x[-1], "final evaluation", f(x[-1]), sep="\n ")
        break
```


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Methods

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9) Week 12: Numerical Algorithms

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- Roots of Nonlinear Equations
- The Bisection Method
- Error for Bisection Method


## Intended Learning Outcomes

## By the end of this session you will be able to...

(1) Understand the basic concepts of numerical analysis.
(2) Use Python to implement algorithms solving numerical problems.

## Introduction to Numerical Analysis

- Numerical analysis is the of algorithms for obtaining numerical (or approximations) solutions of mathematical problems.
- Consider the zero, in the interval $(0,1)$, of the function

$$
f(x)=x-\cos x=0
$$



- Cannot solve exactly, we need to find an approximation.


## Applications of Numerical Analysis

## Solving Mathematical Problems Numerically

- There are many situations similar to the previous slide:
- Solutions of Equations in One Variable
- Interpolation and Polynomial Approximation
- Numerical Differentiation and Integration
- Initial-Value Problems for Ordinary Differential Equations
- Iterative Techniques in Matrix Algebra
- Numerical Solutions of Nonlinear Systems of Equations
- Boundary-Value Problems for Ordinary Differential Equations
- Numerical Solutions to Partial Differential Equations
- In all the above cases advanced numerical techniques are applied in order to approximate solutions.
- You will study some of the topics above in MATH1169 Numerical Mathematics in your second year.


## Roots of Nonlinear Equation

- We are concerned with estimating roots of functions, i.e., $x$ such that $f(x)=0$.
- For example approximating solutions of

$$
f(x)=\frac{1}{x}-\tan (x) \text { or } f(x)=1-x e^{x}
$$

- Problem dates back to 1700 B.C.E Babylonian: they approximated the solution to $f(x)=x^{2}-2$ as $x=1.424222$.
- Using iterative methods, given a function $f(x)$, we generate a sequence $x_{n}$ for $n=1, \ldots, \infty$ which converges to a root $x^{*}$ of $f(x)$ that is

$$
\lim _{n \rightarrow \infty} f\left(x_{n}\right)=0
$$

## The Bisection Method

## Theorem (Intremediate Value Theorem (Bolzano 1817))

Suppose $f$ is a continuous function on an interval $[a, b]$. If $u$ is a number between $f(a)$ and $f(b)$, then there exists $c \in[a, b]$ with $f(c)=u$.


Thus if $f(x)$ is continuous on $[a, b]$ and $f(a) f(b)<0$, then there exists $x^{*} \in[a, b]$ with $f\left(x^{*}\right)=0$.

## Bisection Method Algorithm

- Suppose $f(x)$ is a continuous function on $[a, b]$ and $f(a) f(b)<0$.
- We find a sequence $x_{n}$ conversing to a solution $x^{*}$ of $f$ suing the following procedure.
(1) Let $a_{1}=a$ and $b_{1}=b$.
(2) For $n \geq 1$, calculate $x_{n}=\frac{a_{n}+b_{n}}{2}$. If $f\left(x_{n}\right)=0$, then stop.
(3) If $f\left(x_{n}\right) f\left(a_{n}\right)<0$, set $a_{n+1}=a_{n}$ and $b_{n+1}=x_{n}$.
(1) If $f\left(x_{n}\right) f\left(b_{n}\right)<0$, set $a_{n+1}=x_{n}$ and $b_{n+1}=b_{n}$.
(3) Repeat until $\left|b_{n}-a_{n}\right|$ is sufficiently small.


## Exercise 1 Bisection Method by Hand:

(1) Show that the function

$$
f(x)=x-\cos x
$$

has a root in the interval $(0,1)$.
(2) Preform 3 iterations of the bisection method to find an approximation for the root.

## The Bisection Method In Python

The following is a way to implement the bisection method.

```
f = lambda x: x-math.cos(x) # Function
a,b=0,1 # Initial values
x=[] # Empty list to keep x
err=[f(a)] # First error
NofIt=50 # Number of iterations
tolorance=0.00005 # Error tolorance
for i in range(NofIt): # Go through iterations
    x.append((a+b)/2)
    if f(x[i])*f(a)<0:
        b=x[i]
        else:
        a=x[i]
        e.append(b-a)
        if abs(e[i+1]) < tolorance:
        print("Number of Iterations", i+1, "Final x is",
        x[-1], "final evaluation", f(x[-1]), sep="\n ")
        break
```


## Error and Other Root Finding Methods

## Theorem (Bisection Method)

Suppose $f$ is a continuous function on $[a, b]$ and $f(a) f(b)<0$. The Bisection method generates a sequence $x_{n}$ approximating a zero $x^{*}$ of $f$ with

$$
\left|x_{n}-x^{*}\right| \leq \frac{b-a}{2^{n}}, \text { for } n \geq 1
$$

## Other Root Finding Methods

Other root finding algorithm include:

- The Secant Method,
- Fixed Point Iteration,
- Newton-Raphson Method.

The have similar implementations in Python which you will study in your future years!

## What we did today... <br> Numerical Analysis

Root Finding Algorithms
Introduction, applications


Bisection, Fixed Point

There won't be any!

Have a good holiday season!

## See You Next Time

## Please Do Not Forget To

- Ask any questions now or through my contact details.
- Drop me comments and feedback relating to any aspects of the course.
- Come and see me during Student Drop-in Hours: MONDAYS 12:00-13:00 (MATHS ARCADE) AND FRIDAYS 14:00-15:00 (QM315).
Alternatively, email to make an appointment.


## Thank You!


[^0]:    ${ }^{1}$ Use these notes in conjunction with Excel and Python demos.
    2 Office: QM315, Email: K.NejabatiZenouz@greenwich.ac.uk,
    Student Drop-in Hours: MONDAYS 12:00-13:00 (MATHS ARCADE) AND FRIDAYS 14:00-15:00 (QM315)

[^1]:    ${ }^{3}$ Anything starting with a $\$$ is to be executed in Command (Anaconda)
    Prompt/Terminal. All other codes, and those with $\ggg$, to be executed in Python.

[^2]:    ${ }^{a}$ All of Python's immutable built-in objects are hashable, while no mutable containers (such as lists or dictionaries) are.

