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Outline

- Introduction to Python
- Python variables
- Python data types
 - Number
 - Boolean
 - ▶ list
 - Array in numpy
- Python functions
- if ... else
- for loops
- while loops

 Python is a high-level, general-purpose programming language. Its design philosophy emphasizes code readability with the use of significant indentation.

```
# define a function called factorial
def factorial(n):
   result = 1
   for i in range(1, n + 1):
       result *= i
   return result
# Test the function
result = factorial(5)
print(f"The factorial of 5 is: {result}") # formatted string
## The factorial of 5 is: 120
```

- Download: https://www.python.org/downloads/
 - You do not need to download and install python on your computer for this course.
 - * We'll use cloud computing Google Colaboratory https://colab.research.google.com/notebooks/



- Why you should consider Python?
 - Python is free, open-source.
 - Simplicity and readability: Python's syntax is clear and concise, so we can focus more on the mathematical concepts.
 - Python allows you to execute code interactively using Jupyter Notebooks or or visual stuido code etc.
 - Python packages numpy, sympy and scipy are powerful tools for differential calculus and integral calculus.
 - Community and Resources: Countless online resources, forums, and tutorials are available to help you navigate the world of Python programming for mathematics.
 - ▶ It is a leading programming language in data science.

 $What \ \textit{Is a Python Package?} \\ \text{https://www.udacity.com/blog/2021/01/what-is-a-python-package.html} \\$

- A python module is a Python program that you import, either in interactive mode or into your other programs. 'Module' is really an umbrella term for reusable code.
- A python **package** or **library** is a collection of modules. Modules that are related to each other are mainly put in the same package/library.
- Python Package Index (PyPI) is the repository of software for Python at http://pypi.python.org/pypi. As of a day in December 2023, there are over 200,000 python packages to ease developers' regular programming experience. Once a package/library is successfully installed, then you can import the package/library within your script.

- There are several important Python packages for mathematicians are numPy, sympy, scipy and the built-in module math
- numpy: A fundamental package for scientific computing with Python. It
 provides support for large, multi-dimensional arrays and matrices, along with
 mathematical functions to operate on these arrays.
- **sympy**: A **symbolic** mathematics library that allows for symbolic computation, including algebraic manipulation, equation solving, calculus, and more.
- scipy: SciPy builds on NumPy and provides additional functionality for scientific computing. It includes modules for optimization, integration, ODEs (Ordinary Differential Equation), statistics, and more.
- math: The math module is part of the Python standard library and provides basic mathematical operations. It includes functions for arithmetic, logarithms, trigonometry, and more.

- Python has no command for declaring a variable. A variable is created the moment you first assign a value to it.
- Variable names are case-sensitive.

```
a = 4
A = 40
print(a)
## 4
print(A)
```

```
## 40
```

 A variable can have a short name (like x and y) or a more descriptive name (age, length, total_volume).

- Rules for Python variables:
 - A variable name must start with a letter or the underscore character
 - A variable name cannot start with a number
 - A variable name can only contain alpha-numeric characters and underscores (A-z, 0-9, and _)
 - Variable names are case-sensitive (age, Age and AGE are three different variables)
- Legal variable names:

```
myvar = 9
my_var = 9
_my_var = 9
myVar = 9
myVar = 9
myvar = 9
```

• Illegal variable names:

```
2myvar = 9
my-var = 9
my var = 9
```

 Many Values to Multiple Variables: Python allows you to assign values to multiple variables in one line:

```
x, y, z = 1,2,3
print(x)

## 1
print(y)

## 2
print(z)
```

• And you can assign the same value to multiple variables in one line

```
x= y= z = 4
print(x)
```

4 print(y)

3

- The Python print() function is often used to output variables.
- In the print() function, you output multiple variables, separated by a comma:

```
print(x, y, z)
```

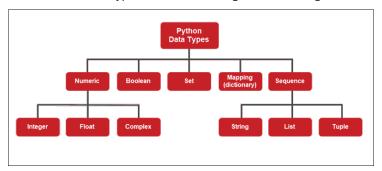
4 4 4

Formatted string

```
print(f"The values of x, y and z are: {x, y, z}.")
```

```
## The values of x, y and z are: (4, 4, 4).
```

- Python has a lot of data types, we consider Number, Boolean and List only.
- A data type is a characteristic that tells the compiler (or interpreter) how a
 programmer intends to use the data. There are two general categories of data
 types, differing whether the data is changeable after definition:
 - Mutable. Data types that are changeable after assignment.
 - ▶ Immutable. Data types that are not changeable after assignment.



Python numbers are created by the standard way

```
var = 382
print(var)
## 382
```

• We use function type() to check data type

```
type(var)
```

```
## <class 'int'>
```

Туре	Format	Description
int	a = 10	Signed Integer
float	a = 45.67	Floating point real values, numbers de-
		fined with a decimal point
complex	a=1+2j	<real part=""> + <complex part="">j</complex></real>

 Most of the time using the standard Python number type is fine. Python will automatically convert a number from one type to another if it needs. But, under certain circumstances that a specific number type is needed (ie. complex, hexidecimal), the format can be forced into a format by using a function.

- For example, let's use the function float() and int()
 - Note: Python3.x Version deleted the long integer data type and the long() function.

```
print(type(float(34)))
## <class 'float'>
print(type(int(34.5)))
## <class 'int'>
print(type(30))
## <class 'int'>
print(type(30/3))
## <class 'float'>
print(type(int(30/3)))
```

<class 'int'>

Python data types: Boolean

• Booleans represent one of two values: True or False.

```
print(type(True))
## <class 'bool'>
print(type(False))
## <class 'bool'>
print(True == 1)
## True
print(False == 0)
## True
print(2 == 2)
## True
print(2 == 3)
```

- A Python list is an ordered mutable/changeable array. Lists allow duplicate elements regardless of their type. Adding or removing members from a list allows changes after creation.
- Create a list in Python by using square brackets, separating individual elements with a comma.
 - ▶ Each element can be of any data type.
- All lists in Python are zero-based indexed. You can access individual list elements. When referencing a member or the length of a list the number of list elements is always the number shown plus one.

```
A = [1, 2, 3, 3.4]
print(A, "is", type(A))
```

```
## [1, 2, 3, 3.4] is <class 'list'>
```

```
B = len(A)
# `len` will return the length of the list which is 3.
# The index is 0, 1, 2, 3.
print(A[0],A[1],A[2],A[3])
## 1 2 3 3.4
print(A[0:2]) #stop=2; the end element is not included
```

- The colon operator: is used for slicing, indexing a specific range and displaying the output using colon operator.
- By leaving out the start value, the range will start at the first item:

```
print(A[:2])
```

[1, 2]

[1, 2]

- Negative indexes are also possible
 - ▶ -1 refers to the last item, -2 refers to the second last item etc.
 - Negative indexing is especially useful for navigating to the end of a long list of members.

```
print(A[-1])
```

3.4

The elements of a list can be list

```
A=[[1,2],[3,4]]
print(A)
```

```
## [[1, 2], [3, 4]]
```

Append Items: To add an item to the end of the list, use the append()
method

```
A=[[1,2],[3,4]]
B=[5,6]
A.append(B)
print(A)
```

```
## [[1, 2], [3, 4], [5, 6]]
```

- Extend Items: To add all elements of an item to the end of the list, use the extend() method
- The following is to append elements from another list to the current list by the extend() method.

```
A=[[1,2],[3,4]]
B=[5,6]
A.extend(B)
print(A)
```

```
## [[1, 2], [3, 4], 5, 6]
```

 Defined in library numpy (http://www.scipy-lectures.org/), vectors and matrices are for numerical data manipulation.

```
import numpy as np
data1 = [1, 2, 3, 4, 5] # list
arr1 = np.array(data1) # 1d array
print(type(arr1))
## <class 'numpy.ndarray'>
print(arr1)
## [1 2 3 4 5]
print(arr1[1]) #python index starts from 0
```

Arrays can be two-dimensional

```
data2 = [range(1, 5), range(5, 9)] # list of lists
# range() generates a range of numbers
arr2 = np.array(data2) # 2d array or matrix.
\# arr2 = np.array([range(1, 5), range(5, 9)])
print(arr2)
## [[1 2 3 4]]
## [5 6 7 8]]
print(np.shape(arr2)) #dimensions of the matrix
##(2, 4)
print(type(arr2))
## <class 'numpy.ndarray'>
print(arr2[0,1])
## 2
print(arr2[1,1])
## 6
```

```
print(arr2[0, :]) # row 0
## [1 2 3 4]
print(arr2[:, 0]) # column 0
## [1 5]
print(arr2[:, :2])
## [[1 2]
## [5 6]]
#columns strictly before index 2 (the first 2 columns)
```

```
print(arr2[:, 2:])

## [[3 4]
## [7 8]]

# columns after index 2 ( column 2 included)

print(arr2[:, 1:4])

## [[2 3 4]
## [6 7 8]]

# columns between index 1 (included) and 4 (excluded)
```

The double colon :: operator in python are used for jumping of elements in multiple axes. It
is also a slice operator. Every item of the sequence gets sliced using double colon.

```
print(arr2[:, 2::]) #it is equivalent to print(arr2[:, 2:])
## [[3 4]
## [7 8]]
print(arr2[:, 2:])
## [[3 4]
```

[7 8]]

- The syntax of a Slice operator using double colon is [Start: Stop: Steps].
 - ▶ Start (Indicates the number from where the slicing will start),
 - Stop(Indicates the number where the slicing will stop) and
 - Steps(Indicates the number of jumps interpreter will take to slice the string) are the three flags and all these flags are integer values.

```
print(arr2[:, 0:3:2]) # all rows, every other column
## [[1 3]
    [5 7]]
##
#The above code can be reduced to a short cut by using double colon ::
print(arr2[:, ::2])
## [[1 3]
    ſ5 7]]
##
print(arr2[:, ::-1]) # reverse order of columns
## [[4 3 2 1]
##
    [8 7 6 5]]
```

```
y=arr2[:, [0,1,2,2]] #column 0,1,2,2 of arr2
print(y)
## [[1 2 3 3]
## [5 6 7 7]]
  vector and matrix of ones
x1=np.ones(3)
print(x1)
## [1. 1. 1.]
x2=np.ones((3,3))
print(x2)
## [[1. 1. 1.]
## [1. 1. 1.]
```

[1. 1. 1.]]

vector and matrix of zeros

```
x1=np.zeros(3)
print(x1)
## [0. 0. 0.]
x2=np.zeros((3,3))
print(x2)
## [[0. 0. 0.]
## [0. 0. 0.]
## [0. 0. 0.]]
x2[0,0]=999 #change element
print(x2)
```

```
## [[999. 0. 0.]
## [ 0. 0. 0.]
## [ 0. 0. 0.]]
```

Python functions

- A function takes a list of argument values, performs a computation with those values, and returns a single result. Python gives you many built-in functions.
 - ▶ see Python Built-in Functions https://docs.python.org/3/library/functions.html

```
print(abs(-2))

## 2
print(round(3.1415926,3))

## 3.142
print(any([True,False]))
```

True

Python functions

- We can also create our own functions. These functions are called user-defined functions.
- Functions are declared using the **def** keyword, and the value produced is returned using the **return** keyword. Consider a simple function which returns the square of the input, $y = x^2$.
 - colon: is used to represent an indented block. It is not for slicing.
 - ▶ Python uses **indentation** to indicate a block of code.
 - The number of spaces is up to you as a programmer, but it has to be at least one.

```
def square(x):
    return x**2

x = 2
y = square(x) # Call the function
print(x,y)
```

2 4

- Comparison Operators (like ==, >, <, >=, <=) are used to evaluate to True or False depending on input condition.
- An if statement is written by using the if keyword.
 - Python relies on indentation to define scope in the code. Other programming languages often use curly-brackets for this purpose.
- if keyword

```
if logical:
    Code to run if logical True

a = 33
b = 200
if b > a:
    print("b is greater than a")
```

else keyword if logical: Code to run if logical True else: Code to run if logical False a = 33b = 33if b > a: print("b is greater than a") else. print("b is not greater than a")

b is not greater than a

• The **elif** keyword is pythons way of saying "if the previous conditions were not true, then try this condition" or **else** if.

```
a = 33
b = 33
if b > a:
   print("b is greater than a")
elif a == b: #no indentation
   print("a and b are equal")
```

a and b are equal

 The else keyword catches anything which isn't caught by the preceding conditions.

```
a = 200
b = 33
if b > a:
    print("b is greater than a")
elif a == b:
    print("a and b are equal")
else:
    print("a is greater than b")
```

a is greater than b

One more example

```
x = 5
if x<5:
    x+=1
elif x>5:
    x-=1
else:
    x=x**2
print(x)
```

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The and keyword is used to combine conditional statements

```
a = 200
b = 33
c = 500
if a > b and c > a:
   print("Both conditions are True")
```

Both conditions are True

The or keyword is used to combine conditional statements

```
a = 200
b = 33
c = 500
if a > b or a > c:
    print("At least one of the conditions is True")
```

At least one of the conditions is True

 A for loop is used for iterating over a sequence (that is either a range, list, a tuple, a dictionary, a set, or a string).

```
for item in iterable:
Code to run
```

• The range() function allows you to iterate over a sequence of numbers. It starts from 0, increments by 1, and stops before a specified number

```
for i in range(4):
   print(i)
```

```
## 0
## 1
## 2
```

```
for i in range(1, 5, 1):
print(i)
## 1
## 2
## 3
## 4
for i in range(1, 10, 2):
print(i)
## 1
```

5

9

 The break statement: with the break statement we can stop the loop before it has looped through all the items

```
for i in [1, 2, 3, 4, 5]:
   if i == 3:
     break
   else:
     print(i)
```

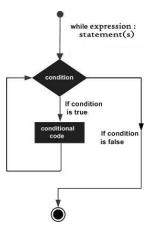
```
## 1
## 2
```

• The continue statement: with the continue statement we can stop the current iteration of the loop, and continue with the next

```
for i in [1, 2, 3, 4, 5]:
    if i == 3:
        continue
    else:
        print(i)
```

- ## 1
- ## 2
- ## 4
- ## 5

 With the while loop we can execute a set of statements as long as a condition is true.



```
a=5
while a<10:
  print(a)
  a+=1
## 5
## 6
## 7
## 8
## 9
print("Out of Loop")
## Out of Loop
```

 while loops should generally be avoided when for loops are sufficient. However, there are situations, for example the number of iterations required is not known in advance, where no for loop equivalent exists.

- Example: use Newton's method find the roots of $f(x) = x^3 5x + 1$.
- First, we define the function and its first derivative

```
def f(x):
    return x**3 - 5*x + 1

def df(x):
    return 3*x**2 - 5
```

```
x \ 0 = 4  #initial quess: -3, 1, 4
x_n = x_0+0.1 #updated x
tolerance=1e-6
max iterations=100
iteration = 0
while iteration < max_iterations and abs(x_n-x_0)>tolerance:
    x 0=x n
    f x n = f(x n)
    df \times n = df(x n)
    x_n = x_n - f_x_n / df_x_n \#updated x_n
    iteration += 1
if abs(x n - x 0) <= tolerance:
    print(f"Root found: {x_n} after {iteration} iterations")
else:
    print("Maximum iterations reached. No root found.")
```

Root found: 2.1284190638445772 after 7 iterations

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Numerical Integration

In this handout, we consider three numerical integration methods: Midpoint Rule, Trapezoidal Rule, and Simpson's Rule. We have discussed the Midpoint Rule in the beginning of the course, but we did not consider Errors of Approximation. We use the three numerical methods to approximate the following integral in this handout.

$$\int_0^1 e^{x^2} \ dx$$

Midpoint Rule

Let $a=x_0 < x_1=a+\frac{b-a}{n} < \cdots < x_i=a+i\frac{b-a}{n} < \cdots < x_n=a+n\frac{b-a}{n}=b$ be a partition of the interval [a,b] with n subintervals of equal length. The approximation to $\int_a^b f(x) \ dx$ using the Midpoint Rule is

$$M_n = \int_a^b f(x) \; dx pprox \Delta x igl[f(ar{x}_1) + \dots + f(ar{x}_{n-1}) + f(ar{x}_n) igr],$$

where $ar{x}_i=rac{x_{i-1}+x_i}{2}$ is the midpoint of the subinterval. And the the error of the Midpoint Approximation E_M is bounded by

$$|E_M|=\left|\int_a^b f(x)\;dx-M_n
ight|\leq rac{K(b-a)^3}{24n^2},$$

where $|f''(x)| \leq K$ on [a, b].

We write a Python function to do the above calculations.

```
import numpy as np

# enclose the comments in triple quotes
def midpoint_rule(func, a, b, n):
    """

    Compute the definite integral of a function using the midpoint rule.

Parameters:
    - func: The function to be integrated.
    - a, b: The interval of integration [a, b].
    - n: The number of subintervals.

Returns:
    - result: The approximate integral.
    - error: An estimate of the absolute error.
    """

dx = (b - a) / n # Width of each subinterval
```

```
x = np.linspace(a, b, n+1)
x_mid = (x[:-1] + x[1:]) / 2
result = np.sum(func(x_mid) * dx)

# Error estimation using the second derivative
x_values = np.linspace(a, b, num=1000)
second_derivative = np.max(np.abs(np.gradient(np.gradient(func(x_values), x_val error = (b - a) * dx**2 * second_derivative / 24

return result, error
```

```
In []: # Example usage:
    def f(x):
        return np.exp(x**2)

# Integration interval and number of subintervals
    a, b = 0, 1
    n = 1000

# Calculate the midpoint rule result and error
    result, error = midpoint_rule(f, a, b, n)

# Display the result and error
    print("Midpoint Rule Result:", result)
    print("Error Estimate:", error)
```

Midpoint Rule Result: 1.462651519383762 Error Estimate: 6.757312382793164e-10

Compare our results with the quad() function in Scipy library.

```
In [ ]: from scipy.integrate import quad
  result, error = quad(f, a, b)
  print("Quad Result:", result)
  print("Error Estimate:", error)
```

Quad Result: 1.4626517459071815 Error Estimate: 1.623869645314337e-14

Trapezoidal Rule

Let $a=x_0 < x_1=a+\frac{b-a}{n} < \cdots < x_i=a+i\frac{b-a}{n} < \cdots < x_n=a+n\frac{b-a}{n}=b$ be a partition of the interval [a,b] with n subintervals of equal length. The approximation to $\int_a^b f(x) \ dx$ using the Trapezoidal Rule is

$$T_n = \int_a^b f(x) \ dx pprox rac{\Delta x}{2} igl[f(x_0) + 2 f(x_1) + \cdots + 2 f(x_{n-1}) + f(x_n) igr].$$

Moreover, if $|f''(x)| \leq K$ on [a,b] and E_T is the error of the approximation, then

$$|E_T| = \left|\int_a^b f(x) \; dx - T_n
ight| \leq rac{K(b-a)^3}{12n^2}.$$

Calculations using the Trapezoidal Rule are similar to the Midpoint Rulewhich is left as a homework.

Simpson's Rule

Partition [a,b] into n=2k subintervals using the end points

$$x_0 = a, x_1 = a + \Delta x, x_2 = a + 2\Delta x, \dots, x_n = a + 2k\Delta x = b.$$

Then

$$S_n = \int_a^b f(x) \ dx pprox rac{\Delta x}{3} \Big[f(x_0) + 4 f(x_1) + 2 f(x_2) + 4 f(x_3) + \cdots \ + 2 f(x_{n-2}) + 4 f(x_{n-1}) + f(x_n) \Big].$$

Moreover, if $|f^{(4)}(x)| \leq K$ for all x in [a,b] and E_S is the error of the Simpson's Rule approximation, then

$$|E_S|=\left|\int_a^b f(x)\;dx-S_n
ight|\leq rac{K(b-a)^5}{180n^4}.$$

```
In [ ]: import numpy as np
                             # enclose the comments in triple quotes
                             def simpsons_rule(func, a, b, n):
                                           Compute the definite integral of a function using Simpson's Rule.
                                           Parameters:
                                            - func: The function to be integrated.
                                           - a, b: The interval of integration [a, b].
                                            - n: The number of subintervals (must be even).
                                           Returns:
                                            - result: The approximate integral.
                                            - error: An estimate of the absolute error.
                                           if n % 2 != 0:
                                                          raise ValueError("The number of subintervals (n) must be even for Simpson's
                                           h = (b - a) / n # Width of each subinterval
                                           x = np.linspace(a, b, n+1)
                                           result = h/3 * (func(x[0]) + 4*np.sum(func(x[1:-1:2])) + 2*np.sum(func(x[2:-2:2])) +
                                           # Error estimation using the fourth derivative
                                           x_values = np.linspace(a, b, num=1000)
                                           fourth_derivative = np.max(np.abs(np.gradient(np.gradient(np.gradient(np.gradient(np.gradient)))
```

```
error = (b - a) * h**4 * fourth_derivative / 180
return result, error
```

```
In []: # Example usage:
    result, error = simpsons_rule(f, a, b, n)

# Display the result and error
    print("Simpson's Rule Result:", result)
    print("Error Estimate:", error)
```

Simpson's Rule Result: 1.4626517459074835 Error Estimate: 1.1351474659300735e-11

Now, we compare our result with the Simpson's Rule in library *Scipy*.

```
In []: from scipy.integrate import simps
# Sample points
x = np.linspace(a, b, 1000)
y = f(x)
result_simpson = simps(y, x)
print("SciPy Simpson's Rule Result:", result_simpson)
#it does not provide estimating error
```

SciPy Simpson's Rule Result: 1.4626517459097506

Calculations of Riemann Sum

In this handout, We use the python package numpy to calculate Riemann sums. NumPy provides a powerful array object that can represent arrays of any dimension. We need 1-dimensional vectors only

1. Getting started

To use numpy, we need to import it to Python first.

```
In [ ]: import numpy as np
        arr = np.array([1, 2, 3, 4, 5])
        print(arr)
        print(arr[0])
        print(arr[0:3]) #The first 3 element
        print(arr[4]) #last element
        print(arr[-1]) #negative index to access the last element of the array
        print(arr[-2])
       [1 2 3 4 5]
       [1 2 3]
       5
In [ ]: #some operations
        print(2*arr)
        arr2= np.array([6, 7, 8, 9, 10])
        print(arr+arr2)
        print(arr*arr2) #element-wise multiplication
       [ 2 4 6 8 10]
       [ 7 9 11 13 15]
       [ 6 14 24 36 50]
In [ ]: np.dot(arr, arr2) #dot product
Out[]: 130
In [ ]: arr@arr2 #dot product
Out[]: 130
In [ ]: np.sum(arr) #sum of all elements
Out[]: 15
```

2. Calculation of Riemann sums

Consider the function $f(x)=x^2-4x$ on the closed interval [0, 4]. Lambda functions in Python are anonymous functions created using the lambda keyword in Python.

```
In []: f = lambda x: x^{**}2-4^*x # input parameter is x
        a = 0
        b = 4
        n = 4 # you may update it to a large number later
In [ ]: f(0)
Out[]: 0
In []: dx=(b-a)/n
In [ ]: import numpy as np
In [ ]: #an array of n+1 evenly spaced values starting from a to b
        x = np.linspace(a,b,n+1)
        print(x)
       [0. 1. 2. 3. 4.]
In [ ]: x_left=x[:-1]
        x_left
Out[]: array([0., 1., 2., 3.])
In [ ]: left_riemann_sum = np.sum(f(x_left) * dx)
        print("Left Riemann Sum:", left_riemann_sum)
       Left Riemann Sum: -10.0
In []: x_right = x[1:]
        x_right
Out[]: array([1., 2., 3., 4.])
In [ ]: right_riemann_sum = np.sum(f(x_right) * dx)
        print("Right Riemann Sum:", right_riemann_sum)
       Right Riemann Sum: -10.0
In []: x_{mid} = (x[:-1] + x[1:])/2
        x_mid
Out[]: array([0.5, 1.5, 2.5, 3.5])
In [ ]: midpoint_riemann_sum = np.sum(f(x_mid) * dx)
        print("Midpoint Riemann Sum:", midpoint_riemann_sum)
       Midpoint Riemann Sum: -11.0
```

using for loop (it is a worse option)

Sequences

A sequence is list of numbers written in a definite order which follows a pattern. Therefore, we can use Python to generate, manipulate, and analyze mathematical sequences.

Printing first n terms of a sequence

```
In [ ]: def f(x):
            return x/(x+1)
        for i in range(1,n+1):
            print(f(i))
       0.5
       0.75
       0.8
       0.8333333333333334
In [ ]: import numpy as np
        def g(x):
            return np.sqrt(x-3)
        n=5
        for i in range(3,n+3):
            print(g(i))
       0.0
       1.4142135623730951
       1.7320508075688772
In [ ]: import numpy as np
        def h(x):
            return np.cos(x*np.pi/6)
        n=5
        for i in range(n):
            print(h(i))
       0.8660254037844387
       0.50000000000000001
       6.123233995736766e-17
       -0.49999999999998
In [ ]: # Fibonacci sequence is defined recursively
        def fibonacci_sequence(n):
            fib_seq = [1, 1] #the first two terms
            while len(fib_seq) < n:</pre>
```

```
fib_seq.append(fib_seq[-1] + fib_seq[-2])
    return fib_seq

# Generate Fibonacci sequence with 10 terms
fibonacci_seq = fibonacci_sequence(10)
print("Fibonacci Sequence:", fibonacci_seq)
```

Fibonacci Sequence: [1, 1, 2, 3, 5, 8, 13, 21, 34, 55]

Limit of a sequence

If one can associate a function f(x) with the sequence $\{a_n\}$, we find the limit of the sequence using the Function Value Theorem.

```
In []: # Find the Limit of the sequence Lnn/n
    from sympy import symbols, limit, log, oo
    n = symbols('n')
    sequence = log(n) / n
    result = limit(sequence, n, oo)
    print("Limit of the sequence ln(n)/n as n approaches infinity:", result)
```

Limit of the sequence ln(n)/n as n approaches infinity: 0

```
In []: # Find the Limit of the sequence (1+5/n)**n
    from sympy import symbols, limit, log, oo
    n = symbols('n')
    sequence = (1+5/n)**n
    result = limit(sequence, n, oo)
    print("Limit of the sequence (1+5/n)**n as n approaches infinity:", result)
```

Limit of the sequence $(1+5/n)^*n$ as n approaches infinity: exp(5)

Computation of limit of a sequence can be done with function sympy.series.limitseq.limit_seq in library Sympy. See Limits of Sequences https://docs.sympy.org/latest/modules/series/limitseq.html

```
In [ ]: from sympy import limit_seq
    from sympy.abc import n
    limit_seq((1+5/n)**n, n)
```

Out[]: e^5

Series

A series is the mathematical expression obtained by adding together **all the terms** of a sequence, capturing the **cumulative sum** of its elements. If the sum of the terms converges to a finite value, the series is said to converge. If the sum of the terms diverges (does not approach a finite value), then the series is said to diverge. Python can be used for determing the convergence of a sereies.

1. Convergence or Divergence of a Series

```
In []: # partial sum of the sequence 1/n

def partial_sum(func,n):
    series_partialsum = 0.0
    for i in range(1, n + 1):
        series_partialsum += func(i)
    return series_partialsum

# Example: Calculate the sum of the first 5 terms

def f(x):
    return 1/x

n=10
result = partial_sum(f,n)

print(f"The sum of the first {n} terms of the sequence is: {result}")
```

The sum of the first 10 terms of the sequence is: 2.9289682539682538

Or we can use function *summation* in library *sympy*.

```
In []: from sympy import symbols, summation
    n=10
    x = symbols('x', integer=True)
    partial_sum_result = summation(f(x), (x, 1, n))
    print(type(partial_sum_result))
    print(partial_sum_result.evalf())
```

<class 'sympy.core.numbers.Rational'>
2.92896825396825

Now let's calculate the limit of the partial sum to check convergence/divergence of the Harmonic Series $\sum 1/n$.

```
In [ ]: from sympy import symbols, summation, oo

x = symbols('x', integer=True)
f = 1/x

# Calculate the partial sum for n=10
```

```
limit_partial_sum = summation(f, (x, 1, oo))
print("Limit of the Partial Sum as n approaches infinity:", limit_partial_sum)
```

Limit of the Partial Sum as n approaches infinity: oo

Let's consider the convergence/divergence of the Alternating Harmonic Series $\sum (-1)^n/n$.

```
In [ ]: g = (-1)**x / x
    limit_partial_sum = summation(g, (x, 1, oo))
    print("Limit of the Partial Sum as n approaches infinity:", limit_partial_sum)
```

Limit of the Partial Sum as n approaches infinity: -log(2)

Another example: convergence/divergence of $\sum \frac{n^2}{e^{2n}}$.

```
In [ ]: from sympy import exp
h = x**2 / exp(2*x)
limit_partial_sum = summation(h, (x, 1, oo))
print("Limit of the Partial Sum as n approaches infinity:", limit_partial_sum)
print(type(limit_partial_sum))
print("Limit of the Partial Sum as n approaches infinity:", limit_partial_sum.evalf

Limit of the Partial Sum as n approaches infinity: (exp(-2) + 1)*exp(-2)/(1 - exp(-2))**3
<class 'sympy.core.mul.Mul'>
Limit of the Partial Sum as n approaches infinity: 0.237679627431505
```

2. Series Expansion

For more information, see Series Expansions

https://docs.sympy.org/latest/modules/series/series.html

```
In [ ]: from sympy import symbols, cos, series
x,p = symbols('x,p')
series((1+x)**p,x,x0=0, n=4) #binomial series
```

Out[]:
$$1+px+rac{px^{2}\left(p-1
ight) }{2}+rac{px^{3}\left(p-2
ight) \left(p-1
ight) }{6}+O\left(x^{4}
ight)$$

$$\text{Out[]: } x - \frac{x^3}{2} + \frac{x^5}{24} - \frac{x^7}{720} + \frac{x^9}{40320} - \frac{x^{11}}{3628800} + \frac{x^{13}}{479001600} + O\left(x^{14}\right)$$

$$\begin{array}{c} \text{Out[]: } x + \frac{x^3}{3} + \frac{2x^5}{15} + \frac{17x^7}{315} + \frac{62x^9}{2835} + \frac{1382x^{11}}{155925} + \frac{21844x^{13}}{6081075} + O\left(x^{14}\right) \end{array}$$

Out[]:
$$x - \frac{x^3}{3} + \frac{x^5}{5} - \frac{x^7}{7} + \frac{x^9}{9} - \frac{x^{11}}{11} + \frac{x^{13}}{13} + O\left(x^{14}\right)$$

3. Formal power series

A formal power series is of the form

$$\sum a_n x^n$$

that is considered independently from any notion of convergence, and can be manipulated with the usual algebraic operations on series (addition, subtraction, multiplication, division, partial sums, etc.).

For more information, see Formal Power Series https://docs.sympy.org/latest/modules/series/formal.html#

3.1 Formal Power Series Expansion

```
In [ ]: from sympy import fps, sin, exp
    from sympy.abc import x
    f1 = fps(exp(x))
    f2 = fps(sin(x))
    f1
```

Out[]:
$$\left(\sum_{k=1}^{\infty} \left\{ egin{array}{ll} rac{x^k}{k!} & ext{for } k mod 1 = 0 \\ 0 & ext{otherwise} \end{array}
ight) + 1$$

$$x + \left(\sum_{k=2}^{\infty} \left\{ egin{array}{l} rac{\left(-rac{1}{4}
ight)^{rac{k}{2} - rac{1}{2}} x^k}{\left(rac{3}{2}
ight)^{\left(rac{k}{2} - rac{1}{2}
ight)} \left(rac{k}{2} - rac{1}{2}
ight)!} & ext{for } k mod 2 = 1 \ 0 & ext{otherwise} \end{array}
ight)$$

3.2 Limit of formal power series

Out[]:
$$\lim_{x \to 0^+} \left(\sum_{k=1}^{\infty} \left\{ egin{array}{ll} rac{x^k}{k!} & ext{for } k mod 1 = 0 \\ 0 & ext{otherwise} \end{array}
ight) + 1$$

3.3 Addition of formal power series

Out[]:
$$\sum_{k=1}^{\infty} x^k \left(-\frac{1}{k} - \frac{\left(-1\right)^{-k}}{k} \right)$$

Out[]:
$$\sum_{k=1}^{\infty} x^k \left(\frac{1}{k} - \frac{(-1)^{-k}}{k} \right)$$

3.4 Composition of functions

Function *compose* returns the truncated terms of the formal power series of the **composed function**, up to specified n.

Out[]:
$$1+x+rac{x^2}{2}-rac{x^4}{8}-rac{x^5}{15}-rac{x^6}{240}+rac{x^7}{90}+rac{31x^8}{5760}+rac{x^9}{5670}+O\left(x^{10}
ight)$$

3.5 Integrating Formal Power Series

Out[]:
$$\frac{x^2}{2} + \left(\sum_{k=3}^{\infty} \left\{ \frac{\left(-\frac{1}{4}\right)^{\frac{k}{2}-1}x^k}{k\left(\frac{3}{2}\right)^{\left(\frac{k}{2}-1\right)}\left(\frac{k}{2}-1\right)!} \right. \text{ for } (k+1) \text{ mod } 2 = 1 \\ 0 \text{ otherwise} \right) - 1$$

Out[]:
$$1-\cos(1)$$

SymPy for Calculus I

SymPy is a Python library for symbolic mathematics. The most well-known commercial programs is certainly Mathematica, while SymPy is one of the most popular free-software computer algebra systems. It aims to become a full-featured computer algebra system (CAS) while keeping the code as simple as possible

1. Getting started

To use sympy, we need to import it to Python first. Let's first see some constants defined in sympy.

2. Symbols

In SymPy we have to declare symbolic variables explicitly to conduct symbolic calculations.

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

y = Symbol('y')

\# \ or \ x, y = symbols("x \ y")

(x+y)**2

Out[ ]: (x+y)^2

In [ ]: \exp \operatorname{and}((x+y)**2) \ \#expand

Out[ ]: x^2 + 2xy + y^2

In [ ]: \operatorname{simplify}(\sin(x)/\cos(x)) \ \#simplify
```

```
3. Limits
In []: \lim_{x \to \infty} \lim_{x \to \infty} \int_{-\infty}^{\infty} \frac{1}{x} dx
Out[ ]: 1
In []: \lim_{x \to \infty} ((1-\cos(x))/x, x, 0)
Out[ ]: 0
In [ ]: # Define a piecewise function
         # fx = Piecewise((x+1, x < 2), (x**2-4, True)) #this does not work
         fx = Piecewise((x+1, x < 2), (x**2-4, x>2), (0, x==2))
         print(fx)
         Piecewise((x + 1, x < 2), (x**2 - 4, x > 2))
In [ ]: plot(fx, (x, -5, 5), xlabel='x', ylabel='f(x)') #it is not nice for the discontinu
                                                    20
                                                    15
                                                     10
                                                 (×)
                                                      5
                     -4
                                                                                          4
                                                    -5 -
Out[]: <sympy.plotting.plot.Plot at 0x1c1902e8c70>
```

In []: # .subs method substitutes a variable with a specific value.

 $print(f'f({x_val}) = {fx.subs(x, x_val)}')$

for x_val in [1.9, 1.99, 1.999, 1.9999]:

4. Differentiation

```
In [ ]: \operatorname{diff}(\sin(x), x)

Out[ ]: \cos(x)

In [ ]: \operatorname{diff}(\exp(\sin(x)), x)

Out[ ]: e^{\sin(x)}\cos(x)

In [ ]: \operatorname{diff}(x^{**}x, x)

Out[ ]: x^{x}(\log(x) + 1)

In [ ]: \underset{x}{\operatorname{finglicit}} \operatorname{differentiation} x = \operatorname{symbols}('x') y = \operatorname{Function}('y')(x) eqn = \sin(y) + y^{**}3 - 6 + x^{**}3 = 0 idiff(eqn, y, x)

Out[ ]: -\frac{3x^{2}}{3y^{2}(x) + \cos(y(x))}
```