



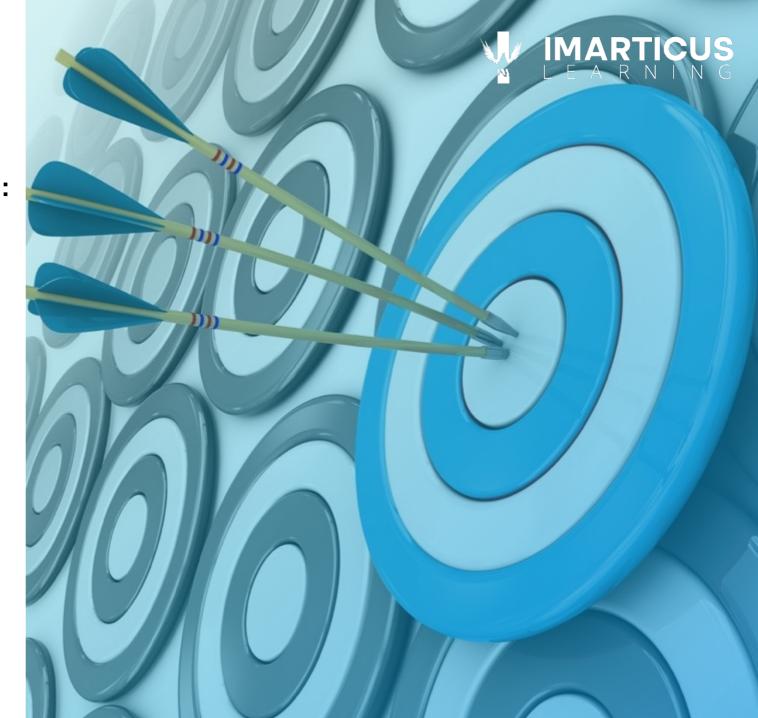
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LEARNING OBJECTIVES

At the end of this session, you will learn:

- Introduction to NumPy
- NumPy Array
- Creating NumPy Array
- Array Attributes
- Array Methods
- Array Indexing
- Slicing Arrays
- Array Operation
- Iteration through Arrays



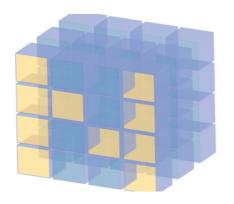


Introduction to NumPy

INTRODUCTION TO NUMPY



NumPy stands for 'Numeric Python'



'Numerical Python'

- Used for mathematical and scientific computations
- Also provides 'linalg' module which contains functions like det, eig, norm to apply linear algebra on NumPy arrays
- NumPy array is the most widely used object of the NumPy library

INTRODUCTION TO NUMPY



Installing NumPy

Use the following command to install Numpy using jupyter notebook

```
# install NumPy
! pip install numpy
```

Importing numpy as alias np is a common practice

```
# import numpy
import numpy as np
```



NumPy array

NUMPY ARRAY



Looks similar to a list

It is a grid of values, indexed by positive integers

It generally contains numeric values. However it can also contain strings

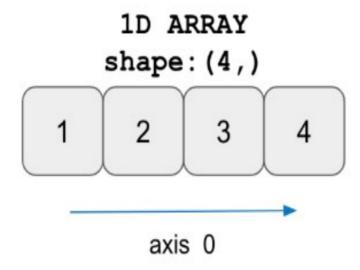
Works faster than lists because it is homogeneous

It can be multidimensional

1D NUMPY ARRAY



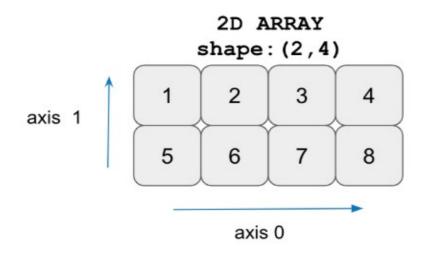
• One dimensional array contains elements only in one dimension. In other words, the shape of the numpy array should contain only one value in the tuple



2D NUMPY ARRAY



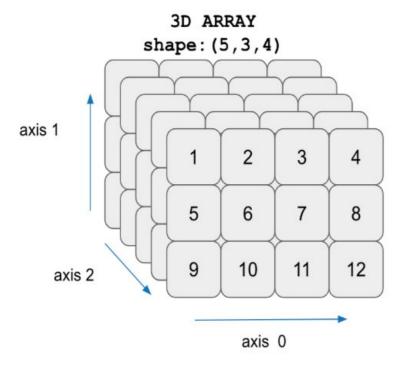
- Two dimensional array is an array within an array
- The position of an data element is referred by two indices instead of one



3D NUMPY ARRAY



 A three-dimensional (3D) array is composed of 3 nested levels of arrays, one for each dimension





Creating NumPy array

CONVERTING A LIST INTO NUMPY ARRAY



• np.array() is used to create a numpy array from a list

```
# declare a list
age_list = [23, 28, 11, 18, 34]

# create array from the list using np.array
age_array = np.array(age_list)

# print the array
print(age_array)

# check the type of age_array
type(age_array)

[23 28 11 18 34]
numpy.ndarray
```

CREATING NUMPY ARRAY



Numpy arrays be used to create array of strings as well

```
# create a numpy array
books = np.array(["Learn Python", "Data Science Journal", "Scala for Data Science"])
# print the numpy string array
print(books)
# check the type of books array
type(books)
['Learn Python' 'Data Science Journal' 'Scala for Data Science']
numpy.ndarray
```



 Create an array of 20 random numbers using random() method from the random module

> random() method returns random numbers over the half-open interval [0.0, 1.0)

The required number of random numbers is passed through the 'size' parameter



- rand() method creates an array of random numbers of the given shape and between (0, 1)
- The dimensions of the returned array, should all be positive
- If no argument is given a single Python float is returned



- The randn() returns a set of values from the standard normal distribution
- The dimensions of the returned array, should all be positive
- If no argument is given a single Python float is returned



• The randint() returns random integers from low (inclusive) to high (exclusive)

```
# Returns one random integer between the values 2 and 10
np.random.randint(2,10)

4

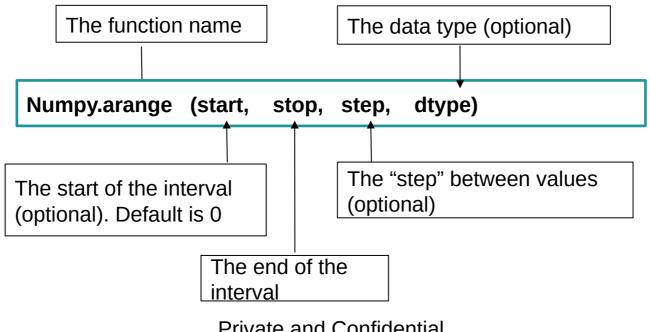
# Returns 10 random integers between 10 and 99
np.random.randint(10, 100, 10)

array([79, 14, 93, 69, 57, 28, 84, 68, 44, 11])
```

CREATING NUMPY ARRAY USING ARANGE()



- np.arange() can also be used to create a NumPy array
- The numbers generated have the same difference
- The function generates as many possible numbers in the given range







```
# create an array of even numbers between 10, 100
# Here 10 is inclusive and 100 is exclusive
evn_nums = np.arange(start = 10, stop = 100, step = 2)
# print the array
print(evn nums)
# check the type of evn_nums
type(evn_nums)
[10 12 14 16 18 20 22 24 26 28 30 32 34 36 38 40 42 44 46 48 50 52 54 56 58
60 62 64 66 68 70 72 74 76 78 80 82 84 86 88 90 92 94 96 98]
numpy.ndarray
```

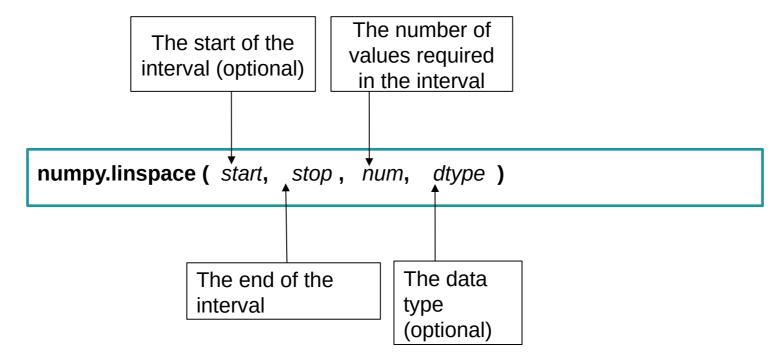
• The np.arange() create a series of values from 10 to 100 with a difference of 2, stored as a numpy array

CREATING NUMPY ARRAY USING LINSPACE()



linspace() generates a specified number of values in a specified range

Syntax:







```
# create of numbers between 1 and 100
# here 1 is and 100 are inclusive
# num is the number of values that we need in our array
nums = np.linspace(start = 1, stop = 100, num = 10)
# print the array
print(nums)
# check the type of nums
type(nums)
   1. 12. 23. 34. 45. 56. 67. 78. 89. 100.]
numpy.ndarray
```

 np.linspace() produces a sequence of 10 evenly spaced values from 1 to 100, stored as a numpy array





Creating 1D numpy array of zeros

```
np.zeros(10)
array([ 0., 0., 0., 0., 0., 0., 0., 0.])
```

• Creating 1D numpy array of ones

```
np.ones(10)
array([ 1., 1., 1., 1., 1., 1., 1., 1.])
```

CREATING 2D NUMPY ARRAY



- np.empty() returns the matrix with arbitrary values of given shape and data type
- 'dtype = object' returns None values

CREATING 2D NUMPY ARRAY



 np.full() returns the matrix of given shape with the value set by the 'fill_value' parameter





• np.identity() returns the identity matrix of specified shape

CREATING 2D NUMPY ARRAY



- np.eye() creates NxM matrix with value '1' on the k-th diagonal and remaining entries as zero
- K > 0 represents upper diagonal
- K < 0 represents lower diagonal

K = 0 represents main diagonal

K > 0 represents upper diagonal

K < 0 represents lower diagonal



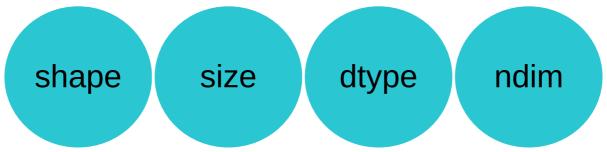
Array Attributes

ARRAY ATTRIBUTES



Attributes are the features/characteristics of an object that describes the object

Some of the attributes of the numpy array are:



Attributes do not have parentheses following them

ARRAY ATTRIBUTES-SHAPE



• The shape returns the number of rows and columns of the array respectively

```
# create array of books with prices
books = np.array([("Learn Python", "Data Science Journal", "Scala for Data Science"), (20, 23, 18)])
# print the shape of the array
print("Shape of the array is: ", books.shape)
Shape of the array is: (2, 3)
```

ARRAY ATTRIBUTES-SIZE



• The size returns the number of elements in an array

```
# create array of books with prices
books = np.array([("Learn Python", "Data Science Journal", "Scala for Data Science"), (20, 23, 18)])
# print the number of elements in the array
print("Number of elements in the array is ", books.size)

Number of elements in the array is 6
```

ARRAY ATTRIBUTES-DTYPE



• The dtype returns the type of the data along with the size in bytes

```
# create array of books with prices
weight_age = np.array([(3.3, 4.2, 5.7), (1, 0.3, 0.8)])
# print the number of elements in the array
print("Number of elements in the array is ", weight_age.dtype)
Number of elements in the array is float64
```

In this example, the array consists of 64-bit floating-point numbers. Thus, the dtype of the array is float64

ARRAY ATTRIBUTES-NDIM



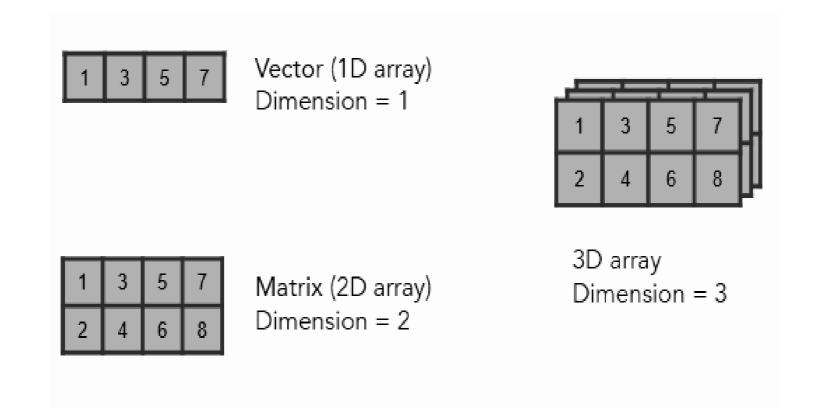
• The ndim returns the number of axes (dimension) of the array

```
# create array of books with prices
books = np.array([("Learn Python", "Data Science Journal", "Scala for Data Science"), (20, 23, 18)])
# print the dimension of the array
print("Number of dimensions of the array: ", books.ndim)

Number of dimensions of the array: 2
```

ARRAY ATTRIBUTES-NDIM







Array Methods

ARRAY METHODS



Methods are object functions that takes parameters in the parentheses and returns the modified object

ARRAY METHODS



• In this example, the reshape(6, 1) is reshaping a 3 X 2 array to 6 X 1 array

```
# create an array of age and name of employee
employee = np.array([("Charles", 18), ("Logan", 20), ("Jessica", 34)])
print("Created array: ", employee)
# change the shape of array
employee reshaped = employee.reshape(6,1)
# print the reshaped array
print("\nReshaped array: ",employee_reshaped)
Created array: [['Charles' '18']
 ['Logan' '20']
 ['Jessica' '34']]
Reshaped array: [['Charles']
['18']
 ['Logan']
 ['20']
 ['Jessica']
 ['34']]
```



Array Indexing

INDEXING ARRAY



- The element in the array can be accessed by the positional index of the element
- The index for an array starts at 0 from left and at -1 starts from the right

```
# create an array of name and age of data scientists
data_scientists = np.array([("Charles", 18), ("Logan", 20), ("Jessica", 34)])
# retrieve the last element of the array
print( "last element: ",data scientists[-1])
last element: ['Jessica' '34']
# retrieve the element at the index position 1 of the array
print("element at index position 1: ",data scientists[1])
element at index position 1: ['Logan' '20']
# retrieve the age of data scientist at the first position
data scientists[0][1]
'18'
```



Slicing Array





				Expression	Shape	Output
	10	20	30			([[40,50],
	40	50	60	array[1: , :2]	(2,2)	[70,80]])
	70	80	90			
	10	20	30	array[1]	(3,)	(540,50,00))
	40	50	60	array[1:2, :]	(1,3)	([40,50,60])
	70	80	90	anay[1.2, .]	(1,0)	
	10	20	30	array[0,1:] array[0:1, 1:]	(2,)	([20,30])
	40	50	60		(1,2)	
	70	80	90	diay[o.1, 1.]	(1,2)	





Slicing allows us to access more than one element

```
# consider a 1d array
weight = np.array([73, 68, 55.5, 43, 92, 66])
# retrieve the 4th and the 5th element
print("4th and 5th element: ", weight[3:5])
#retrieve every third element starting from the first element
print("every second element: ", weight[0::3])
# retrieve all the element before 43
print("Elements before 43: ",weight[:3])
4th and 5th element: [ 43. 92.]
every second element: [ 73. 43.]
Elements before 43: [ 73. 68. 55.5]
```

SLICING 2D ARRAY



Slicing in 2d array returns a sub-matrix of the original matrix

```
# create a 2d array
age = np.array([(73, 68, 54), (21, 36, 19)])
# print the 2d array
print("Original array: ", age)
# retrieve the elements in the 1st row and first two columns
print("\nElements from first row and first two columns: ", age[0,0:2])
# retrieve the elements from 2nd row and 2nd and 3rd column
print("\nElements from second row and last two columns: ", age[1,1:])
Original array: [[73 68 54]
[21 36 19]]
Elements from first row and first two columns: [73 68]
Elements from second row and last two columns: [36 19]
```





```
Slicing a 2D array
# declare a 2D array
prices = np.array([[101, 131, 122, 113, 143],
               [145, 165, 137, 318, 193],
               [240, 241, 252, 253, 324],
               [225, 126, 727, 928, 129]])
# print the array
prices
array([[101, 131, 122, 113, 143],
       [145, 165, 137, 318, 193],
       [240, 241, 252, 253, 324],
       [225, 126, 727, 928, 129]])
# select all rows except 1st
# select 3rd and 4th column
prices[1:,2:4]
array([[137, 318],
       [252, 253],
       [727, 928]])
```

The index returns an element of the array, the slice returns a list of elements.





If you try to add arrays with different dimensions, you get an error.



Array Operations



Addition and Subtraction of 1D array

```
# consider odd_num and even_num
odd_num = np.array([3,7,5,9])
print('odd_num:',odd_num)
even_num = np.array([8,10,4,2])
print('even num:',even num)
# add odd_num and even_num element-wise
sum = odd_num + even_num
print('Addition:', sum)
# subtract the even num from odd num
sub = odd num - even num
print('Subtraction:', sub)
odd num: [3 7 5 9]
even_num: [ 8 10 4 2]
Addition: [11 17 9 11]
Subtraction: [-5 -3 1 7]
```



Multiply each element in the array by 2

```
num_array = np.array([1,2,3,4,5])
print('updated_array:', num_array*2)
updated_array: [ 2 4 6 8 10]
```



Element-wise multiplication of two 3x3 matrices

$$\begin{bmatrix} 1 & 0 & 2 \\ 4 & -2 & 3 \end{bmatrix} \circ \begin{bmatrix} 4 & 0 & 1 \\ 2 & 3 & 0 \end{bmatrix} = \begin{bmatrix} 1X4 & 0X0 & 2X1 \\ 4X2 & -2X3 & 3X0 \end{bmatrix}$$
m1 m2 m1 * m2

```
m1 = np.array([[1,0,2],[4,-2,3]])
m2 = np.array([[4,0,1],[2,3,0]])

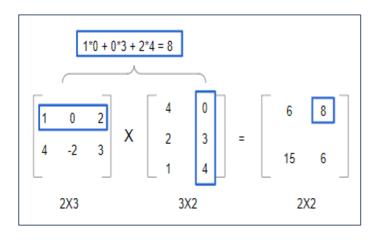
# element-wise multiplication
prod = m1*m2
print('element-wise multiplication:\n',prod)

element-wise multiplication:
[[4 0 2]
[8 -6 0]]
```

This product is also known as 'Hadamard Product'



Matrix multiplication of two 3x3 matrices



```
m1 = np.array([[1,0,2],[4,-2,3]])
m2 = np.array([[4,0],[2,3],[1,4]])

# dot() returns the matrix multiplication of the matrices m1 and m2
multi = m1.dot(m2)
print('matrix multiplication:\n',multi)

matrix multiplication:
[[ 6  8]
[15  6]]
```



• The min() returns the minimum value present in the array

```
# consider an array contains salary of employees
salary = np.array([100000, 2000, 45000, 980000, 1000, 75500])
# print the minimum salary from the array
print("Minimum salary in array: ", salary.min())
Minimum salary in array: 1000
```

• The max() returns the maximum value present in the array

```
# consider an array contains salary of employees
salary = np.array([100000, 2000, 45000, 980000, 1000, 75500])
# print the maximum salary from the array
print("Maximum salary in array: ", salary.max())
Maximum salary in array: 980000
```



The var() returns the variance of all the elements in the array

```
# consider an array contains salary of employees
salary = np.array([100000, 2000, 45000, 980000, 1000, 75500])
# print the variance in salaries of the employees
print("Variance is salaries: ", salary.var())
Variance is salaries: 122788034722.0
```

The std() returns the standard deviation of all the elements in the array

```
# consider an array contains salary of employees
salary = np.array([100000, 2000, 45000, 980000, 1000, 75500])
# print the std. dev in salaries of the employees
print("Standard deviation in employee salaries: ", salary.std())
Standard deviation in employee salaries: 350411.236581
```





• The np.square() returns the square of the elements

```
# create an array of sides of a square
sq_sides = np.array([20, 35, 40, 60, 75])
# print the area of all the squares
print("Area of squares: ", np.square(sq_sides))
Area of squares: [ 400 1225 1600 3600 5625]
```

The np.power() is used to raise the numbers in the array to the given value

```
# create an array of sides of cube
cube_sides = np.array([2, 3, 40, 6, 7])
# print the volume of cubes
print("Volume of cubes: ", np.power(cube_sides,3))
Volume of cubes: [ 8 27 64000 216 343]
```



• The np.transpose() reverses the dimension of the array

```
# create an array of name and age of data scientists
data_scientists = np.array([("Charles", 18), ("Logan", 20), ("Jessica", 34)])
# print the original matrix
print("\nOriginal Matrix: ", data scientists)
# print the transpose of the matrix
print("\nTranspose: ", np.transpose(data_scientists))
Original Matrix: [['Charles' '18']
['Logan' '20']
['Jessica' '34']]
Transpose: [['Charles' 'Logan' 'Jessica']
['18' '20' '34']]
```

CONCATENATE 1D ARRAY



 Two or more arrays will get joined along existing (first) axis, provided they have the same shape

```
# create an array of age of employees
age = np.array([19, 22, 18, 20, 38, 21])
# create an array of weight of employees
weight = np.array([73, 68, 55, 43, 92, 66])
# concatenate the two arrays
employees = np.concatenate([age, weight])
# print the concatenated array
print("Concatenated array: ",employees)
Concatenated array: [19 22 18 20 38 21 73 68 55 43 92 66]
```

CONCATENATE 2D ARRAY



We can concatenate 2D arrays either along rows (axis = 0) or columns (axis = 1), provided they have same shape

```
# create an array of name and age of data scientists
data_scientists = np.array([["Charles", 18], ["Logan", 20], ["Jessica", 34]])
# create an array of name and age of consultants
consultants = np.array([["Jean", 21], ["Phoenix", 20]])
# concatenate the two arrays as employees
employee = np.concatenate([data scientists, consultants])
# print the employees
print("All Employees: ", employee)
All Employees: [['Charles' '18']
['Logan' '20']
 ['Jessica' '34']
 ['Jean' '21']
 ['Phoenix' '20']]
```



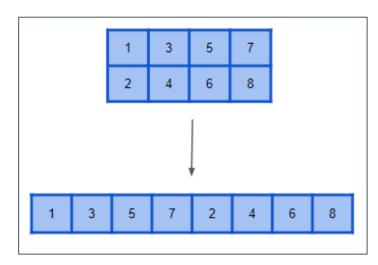


We can not concatenate the arrays with different dimensions

FLATTEN THE ARRAY



The flatten() function collapses the original array into a single dimension



```
# create 2D array
num_array = np.array([[1, 3, 5, 7],[2, 4, 6, 8]])
print('Original array:\n', num_array)

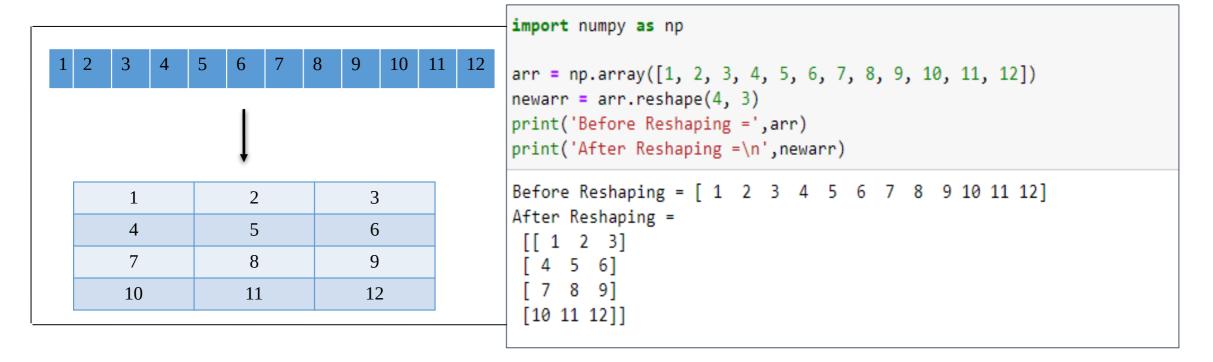
# flatten the array into 1D
print('Flattened array:\n', np.ndarray.flatten(num_array))

Original array:
[[1 3 5 7]
[2 4 6 8]]
Flattened array:
[1 3 5 7 2 4 6 8]
```





- Reshaping means changing the shape of an array.
- The shape of an array is the number of elements in each dimension.
- By reshaping we can add or remove dimensions or change the number of elements in each dimension.



Vertical Stack (vstack)



- You can do vertical staking for one vector (vstack)
- If you want to perform for more than one vector you want to mention in the list
- If you are vertically stacking more than one array the size of array should be same

```
#vertical stack(vstack)
a=np.array([5,6,96,36,8,3])
np.vstack(a)
array([[ 5],
       [ 6],
       [96],
       [36],
       [8],
       [ 311)
# Vertically stacking vectors
v1 = np.array([1,2,3,4])
v2 = np.array([5,6,7,8])
np.vstack([v1,v2,v1,v2,v2])
array([[1, 2, 3, 4],
       [5, 6, 7, 8],
       [1, 2, 3, 4],
       [5, 6, 7, 8],
       [5, 6, 7, 8]])
```

Horizontal Stack (hstack)



- You can do horizontal staking for one vector (hstack)
- If you want to perform for more than one vector you want to mention in the list
- If you are horizontally stacking more than one array the size of array may be different not an issue

```
# Horizontal stack (hstack)
a=np.array([[4,6,6,99],[5,5,9,62]])
print(a)
h=np.hstack(a)
print("hstack=",h)
[5 5 9 62]]
flatten= [ 4 6 6 99 5 5 9 62]
hstack= [ 4 6 6 99 5 5 9 62]
# Horizontal stack
h1 = np.ones((2,4))
h2 = np.zeros((2,2))
np.hstack([h1,h2,h2])
array([[1., 1., 1., 0., 0., 0., 0.],
      [1., 1., 1., 1., 0., 0., 0., 0.]])
```



Iterating through Arrays

ITERATING THROUGH 1D ARRAY



The for loop can be used to iterate through the array elements

```
# create an array of books
books = np.array(["Data Science with Python", "Machines are Learning", "DIY - Deep Learning"])
#print the dimension of the array
print("The array 'books' is", books.ndim, "dimensional array\n")
# print each element of the array
for i in books:
   print(i)
The array 'books' is 1 dimensional array
Data Science with Python
Machines are Learning
DIY - Deep Learning
```

ITERATING THROUGH 2D ARRAY



```
# create an array of books
books = np.array([["Data Science with Python", "Machines are Learning", "DIY - Deep Learning"], [25, 55.5, 40]])
#print the dimension of the array
print("The array 'books' is", books.ndim, "dimensional array\n")
# print each element of the array
for i in books:
    print(i)
The array 'books' is 2 dimensional array
['Data Science with Python' 'Machines are Learning' 'DIY - Deep Learning']
['25' '55.5' '40']
```

ITERATING THROUGH 2D ARRAY USING NESTED FOR LOOP



To print each element in the 2D array, use nested for loop

```
# create an array of books
books = np.array([["Data Science with Python", "Machines are Learning", "DIY - Deep Learning"], [25, 55.5, 40]])
#print the dimension of the array
print("The array 'books' is", books.ndim, "dimensional array\n")
# print each element of the array
for i in books:
   for j in i:
        print(j)
The array 'books' is 2 dimensional array
Data Science with Python
Machines are Learning
DIY - Deep Learning
25
55.5
40
```





NumPy arrays are faster than list. The below code shows that NumPy arrays are very much faster than the lists in python.

Time taken by lists : 0.24913430213928223 seconds

Time taken by arrays: 0.0014355182647705078 seconds

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