

Python library - NumPy (*)

Numpy is a library for scientific computing. It provides a multidimensional array object (**ndarray** also known by the alias **array**) and support for fast operations on arrays. Following are the main differences between NumPy arrays and Python data types

- Fixed size arrays
- The data type of array elements must be the same (can be objects)
- More efficient and easier to implement operations
- Vectorised approach is more compact and easier to understand

(*) <https://numpy.org/doc/stable/user/index.html>

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ndarray is a multidimensional array class, known also by the name `array`, with elements of the same type and indexed by a tuple of non-negative integers. Following are listed some of the attributes of **ndarray**.

| | |
|-------------------------|--|
| ndarray.ndim | Number of dimensions (axes) of the array |
| ndarray.shape | Size of the array in each dimension (tuple of integers) |
| ndarray.size | Total number of the elements of the array |
| ndarray.dtype | Object type of the elements of the array (<code>numpy.int32</code> , <code>numpy.float64</code>) |
| ndarray.itemsize | Number of bytes of each element of the array (4 bytes for <code>numpy.int32</code>) |
| ndarray.data | Container of the elements of the array (no need to use for indexed access) |

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NumPy supports a great variety of numerical types. The primitive types are closely related to those in C.

numpy.int8 One byte integer (int16, int32, int64)

numpy.uint8 One byte unsigned integer (uint16, uint32, uint64)

numpy.float32 Four bytes float (float64 – builtin Python float)

numpy.complex64 Complex number (4 bytes real and imaginary componentes)

numpy.complex128 Complex number (8 bytes real/imaginary – builtin Python complex)

The data type can be defined with **dtype**: `a = np.array([[1,2],[3,4]], dtype=np.float64)`

Or **dtype** can be used to get the data type: `a.dtype`
 `dtype('float64')`

astype can be used to convert the data type: `a.astype(int)`

float64 is the default data type

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Creating arrays

There are several ways for creating numpy arrays:

- Conversion from Python data types (lists, tuples, ...)
 - `numpy.array([[1,-2],[5,3]])`
- Using numpy methods
 - `numpy.arange(initial, final, step)` works as Python range
 - `numpy.ones((dim1,dim2))` creates a dim1xdim2 size array with ones
 - `numpy.zeros((dim1,dim2))` creates a dim1xdim2 size array with zeros
 - `numpy.linspace(initial, final, n)` creates **n** of elements between initial and final values
 - `numpy.random.rand(n)` creates **n** random elements (uniform in [0, 1[)
 - `numpy.eye(n)` creates an identity matrix with **n** ones in the diagonal
- Importing data
 - `numpy.genfromtxt('person.csv', skip_header=1, delimiter=";")`

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Creating arrays - examples

```
In [1]: ### NumPy - Python scientific library
import numpy as np
```

```
In [2]: # arange() works similar to range()
np.arange(1, 9, 2)
```

```
Out[2]: array([1, 3, 5, 7])
```

```
In [3]: # reshape defines the array dimensions
np.arange(12).reshape(3,4)
```

```
Out[3]: array([[ 0,  1,  2,  3],
               [ 4,  5,  6,  7],
               [ 8,  9, 10, 11]])
```

```
In [4]: # creates an array from a list
np.array([[1,-2],[5,3]])
```

```
Out[4]: array([[ 1, -2],
               [ 5,  3]])
```

```
In [5]: # creates an array with zeros
np.zeros((2,3))
```

```
Out[5]: array([[0., 0., 0.],
               [0., 0., 0.]])
```

```
In [6]: # creates an array of type int with ones
np.ones((2,3), dtype=int)
```

```
Out[6]: array([[1, 1, 1],
               [1, 1, 1]])
```

```
In [7]: # creates an array from a csv file
np.genfromtxt('data.csv', delimiter=";")
```

```
Out[7]: array([[ 1.,  2.,  3.,  4.],
               [ 5.,  6.,  7.,  8.],
               [ 9., 10., 11., 12.],
               [13., 14., 15., 16.]])
```

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Array operations examples - All arithmetic operates elementwise

In [8]: *# Product of two arrays in Python*

```
a = [1,2,3]
b = [6,5,4]
c = list()
for i in range(len(a)):
    c.append(a[i] * b[i])
print(c)
```

[6, 10, 12]

In [9]: *# Product of two arrays using NumPy*

```
# arrays must be declared
a = np.array([1,2,3])
b = np.array([6,5,4])
c = a * b
c
```

Out[9]: array([6, 10, 12])

Basic operations

In [10]: a - b

Out[10]: array([-5, -3, -1])

In [11]: b**2

Out[11]: array([36, 25, 16], dtype=int32)

In [12]: 5 * np.sqrt(a)

Out[12]: array([5. , 7.07106781, 8.66025404])

In [13]: a > 2

Out[13]: array([False, False, True])

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Universal functions (ufuncs) (*)

| Function | Description |
|---|---|
| abs, fabs | Compute the absolute value element-wise for integer, floating-point, or complex values |
| sqrt | Compute the square root of each element (equivalent to <code>arr ** 0.5</code>) |
| square | Compute the square of each element (equivalent to <code>arr ** 2</code>) |
| exp | Compute the exponent e^x of each element |
| log, log10, log2, log1p | Natural logarithm (base e), log base 10, log base 2, and $\log(1 + x)$, respectively |
| sign | Compute the sign of each element: 1 (positive), 0 (zero), or -1 (negative) |
| ceil | Compute the ceiling of each element (i.e., the smallest integer greater than or equal to that number) |
| floor | Compute the floor of each element (i.e., the largest integer less than or equal to each element) |
| rint | Round elements to the nearest integer, preserving the dtype |
| modf | Return fractional and integral parts of array as a separate array |
| isnan | Return boolean array indicating whether each value is NaN (Not a Number) |
| isfinite, isinf | Return boolean array indicating whether each element is finite (non-inf, non-NaN) or infinite, respectively |
| cos, cosh, sin, sinh, tan, tanh | Regular and hyperbolic trigonometric functions |
| arccos, arccosh, arcsin, arcsinh, arctan, arctanh | Inverse trigonometric functions |
| logical_not | Compute truth value of not x element-wise (equivalent to <code>~arr</code>). |

(*) Python for Data Analysis, Wes McKinney, O'Reilly

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Binary universal functions (ufuncs) (*)

| Function | Description |
|--|--|
| add | Add corresponding elements in arrays |
| subtract | Subtract elements in second array from first array |
| multiply | Multiply array elements |
| divide, floor_divide | Divide or floor divide (truncating the remainder) |
| power | Raise elements in first array to powers indicated in second array |
| maximum, fmax | Element-wise maximum; fmax ignores NaN |
| minimum, fmin | Element-wise minimum; fmin ignores NaN |
| mod | Element-wise modulus (remainder of division) |
| copysign | Copy sign of values in second argument to values in first argument |
| greater, greater_equal, less, less_equal, equal, not_equal | Perform element-wise comparison, yielding boolean array (equivalent to infix operators >, >=, <, <=, ==, !=) |
| logical_and | Compute element-wise truth value of AND (&) logical operation. |
| logical_or | Compute element-wise truth value of OR () logical operation. |
| logical_xor | Compute element-wise truth value of XOR (^) logical operation. |

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Basic array statistical methods (*)

| Method | Description |
|----------------|--|
| sum | Sum of all the elements in the array or along an axis; zero-length arrays have sum 0 |
| mean | Arithmetic mean; invalid (returns NaN) on zero-length arrays |
| std, var | Standard deviation and variance, respectively |
| min, max | Minimum and maximum |
| argmin, argmax | Indices of minimum and maximum elements, respectively |
| cumsum | Cumulative sum of elements starting from 0 |
| cumprod | Cumulative product of elements starting from 1 |

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Random functions (*)

| Function | Description |
|-------------|--|
| seed | Seed the random number generator |
| permutation | Return a random permutation of a sequence, or return a permuted range |
| shuffle | Randomly permute a sequence in-place |
| rand | Draw samples from a uniform distribution |
| randint | Draw random integers from a given low-to-high range |
| randn | Draw samples from a normal distribution with mean 0 and standard deviation 1 (MATLAB-like interface) |
| binomial | Draw samples from a binomial distribution |
| normal | Draw samples from a normal (Gaussian) distribution |
| uniform | Draw samples from a uniform [0, 1) distribution |

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linalg functions (*)

| Function | Description |
|----------------------|--|
| diag | Return the diagonal (or off-diagonal) elements of a square matrix as a 1D array, or convert a 1D array into a square matrix with zeros on the off-diagonal |
| dot | Matrix multiplication |
| trace | Compute the sum of the diagonal elements |
| det | Compute the matrix determinant |
| eig | Compute the eigenvalues and eigenvectors of a square matrix |
| inv | Compute the inverse of a square matrix |
| solve | Solve the linear system $Ax = b$ for x , where A is a square matrix |
| lstsq | Compute the least-squares solution to $Ax = b$ |
| np.transpose(ma) | Returns the transpose of the matrix |
| ma.flatten() | Transforms the matrix in a one-dimensional numpy array |

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Matrix operations - examples

Matrix/vector operations

```
In [15]: ma = np.array([[1, -2], [5, 3]])
ma
```

```
Out[15]: array([[ 1, -2],
               [ 5,  3]])
```

```
In [16]: mb = np.array([[-1, 2], [4, 1]])
mb
```

```
Out[16]: array([[-1,  2],
               [ 4,  1]])
```

```
In [17]: # Matrix product
ma @ mb
np.dot(ma, mb)
```

```
Out[17]: array([[ -9,  0],
               [  7, 13]])
```

```
In [18]: # Matrix transpose
np.transpose(ma)
```

```
Out[18]: array([[ 1,  5],
               [-2,  3]])
```

```
In [19]: # Matrix determinant
np.linalg.det(ma)
```

```
Out[19]: 13.0
```

```
In [20]: # Matrix inverse
np.linalg.inv(ma)
```

```
Out[20]: array([[ 0.23076923,  0.15384615],
               [-0.38461538,  0.07692308]])
```

```
In [21]: # Matrix flatten
ma.flatten()
```

```
Out[21]: array([ 1, -2,  5,  3])
```

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Python and NumPy execution time comparison

```
In [22]: ### Python and numpy time comparison
import numpy as np
import time
a = range(1, 10000001)
b = range(1, 10000001)
c = list()
t1 = time.perf_counter()
for i in range(len(a)):
    c.append(a[i] / b[i])
t2 = time.perf_counter()
print(f'Python time: {t2 - t1:0.4}')
```

Python time: 4.774

```
In [23]: a = np.arange(1, 10000001)
b = np.arange(1, 10000001)
t1 = time.perf_counter()
c = a / b
t2 = time.perf_counter()
print(f'NumPy time: {t2 - t1:0.4}')
```

NumPy time: 0.1221