



5.3 数组运算

■ 数组元素的切片——一维数组

可以使用切片来访问NumPy数组中的一部分，切片方法和Python序列数据结构的切片一样

```
>>>a=np.array([0,1,2,3])
>>>a[ 0:3 ]
array([ 0, 1, 2 ])

>>>a[ :3]
array([ 0, 1, 2 ])

>>>a[0: ]
array([ 0, 1, 2 ,3])
```



■ 数组元素的切片——二维数组

```
>>>b=np.array([[0,1,2,3],[4,5,6,7],[8,9,10,11]])
>>>b
array([[ 0,  1,  2,  3],
       [ 4,  5,  6,  7],
       [ 8,  9, 10, 11]])
```

```
>>>b[0]
array([0,1,2,3])

>>> b[0:2]
array([[0, 1, 2, 3],
       [4, 5, 6, 7]])

>>> b[:2]
array([[0, 1, 2, 3],
       [4, 5, 6, 7]])
```

```
>>>b[0:2, 0:2]
array([[0, 1],
       [4, 5]])

>>>b[0:2,1:3]
array([[1, 2],
       [5, 6]])

>>>b[:,0]
array([0, 4, 8])
```



■ 数组元素的切片——三维数组

```
>>>t= np.array([[[0,1,2,3],[4,5,6,7],[8,9,10,11]],  
                [[12,13,14,15],[16,17,18,19],[20,21,22,23]]])
```

```
>>> t  
array([[[ 0,  1,  2,  3],  
        [ 4,  5,  6,  7],  
        [ 8,  9, 10, 11]],  
       [[12, 13, 14, 15],  
        [16, 17, 18, 19],  
        [20, 21, 22, 23]]])
```

```
>>>t[:, :, 0]  
array([[ 0,  4,  8],  
       [12, 16, 20]])
```

```
>>> t[:, :, 1]  
array([[ 1,  5,  9],  
       [13, 17, 21]])
```



■ 改变数组的形状

函 数	功能描述
np.reshape(shape)	不改变当前数组 ，按照shape创建新的数组
np.resize(shape)	改变当前数组 ，按照shape创建数组

```
>>>b = np.arange(12)
>>>b
array([ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11 ])
```

```
>>> b.reshape(3,4)
array([[ 0, 1, 2, 3],
       [ 4, 5, 6, 7],
       [ 8, 9,10,11]])
```

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

```
>>>b.resize(3, 4)
>>>b
array([[ 0, 1, 2, 3],
       [ 4, 5, 6, 7],
       [ 8, 9,10,11]])
```



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当改变形状时，应该考虑到数组中元素的个数，确保改变前后，**元素总个数相等**。

```
>>>b = np.arange(12)
>>>b
array([ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11])
```

```
>>>b.reshape(2,5)
ValueError: cannot reshape array of size 12 into shape(2,5) 错误提示
```



□ 创建数组并且改变数组形状

```
>>>b = np.arange(12)
>>>b.reshape(3,4)
```

```
>>>b = np.arange(12).reshape(3,4)
>>>b
array([[ 0,  1,  2,  3],
       [ 4,  5,  6,  7],
       [ 8,  9, 10, 11]])
```

```
>>>t = np.arange(24).reshape(2, 3, 4)
>>>t
array([[[ 0,  1,  2,  3],
        [ 4,  5,  6,  7],
        [ 8,  9, 10, 11]],
       [[12, 13, 14, 15],
        [16, 17, 18, 19],
        [20, 21, 22, 23]]])
```



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```
>>>b.reshape(-1,1)
```

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

参数-1：根据数组中元素总个数、以及其他维度的取值，来**自动计算**出这个维度的取值。

```
>>>b.reshape(-1)
```

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



■ 数组间的运算

```
>>> a = np.array([0,1,2,3])  
>>> d = np.array([2,3,4,5])  
>>> a+d  
array([[ 2,  4,  6,  8]])
```

相加的2个数组的**形状**和**长度**应该一致，否则就会出现错误

```
>>> d = np.array([1,2])           #创建一维数组  
>>> a+d                           #数组内的元素个数不同，无法相加  
-----  
ValueError                                Traceback (most recent call last)  
<ipython-input-3-637545a26abd> in <module>()  
----> 1 a+d  
  
ValueError: operands could not be broadcast together with shapes (4,) (2,)
```



一维数组可以和**多维数组**相加，相加时会将一维数组**扩展**至多维。

```
>>>a = np.array([0,1,2,3])
>>>b = np.array([[0,1,2,3],[4,5,6,7],[8,9,10,11]])
>>> a+b
array([[ 0,  2,  4,  6],
       [ 4,  6,  8, 10],
       [ 8, 10, 12, 14]])
```

```
>>>b ** 2
array([[ 0,  1,  4,  9],
       [16, 25, 36, 49],
       [64, 81, 100, 121]], dtype=int32)
```

- 数组之间的**减法**、**乘法**、**除法**运算，和加法运算规则相同。
- 当两个数组中元素的数据类型不同时，精度低的数据类型，会**自动转换**为精度更高的数据类型，然后再进行运算。



■ 矩阵运算——矩阵乘法

□ 乘号运算符：矩阵中对应的元素分别相乘

$$\begin{matrix} A & B & A*B \\ \begin{bmatrix} 1 & 1 \\ 0 & 1 \end{bmatrix} & \times \begin{bmatrix} 2 & 0 \\ 3 & 4 \end{bmatrix} & = \begin{bmatrix} 2 & 0 \\ 0 & 4 \end{bmatrix} \end{matrix}$$

```
>>>A = np.array([[1,1],[0,1]])  
>>>B = np.array([[2,0],[3,4]])  
>>>C = A * B  
>>>C  
array([[2, 0],  
       [0, 4]])
```

□ 矩阵相乘：按照矩阵相乘的规则运算

$$\begin{matrix} A & B & \text{矩阵相乘} \\ \begin{bmatrix} 1 & 1 \\ 0 & 1 \end{bmatrix} & \times \begin{bmatrix} 2 & 0 \\ 3 & 4 \end{bmatrix} & = \begin{bmatrix} 5 & 4 \\ 3 & 4 \end{bmatrix} \end{matrix}$$

```
>>>np.matmul(A,B)  
array([[5, 4],  
       [3, 4]])
```

```
>>> np.dot(A,B)  
array([[5, 4],  
       [3, 4]])
```



■ 矩阵运算——矩阵乘法

□ @运算符：连续进行矩阵乘法

A B C 矩阵相乘

$$\begin{bmatrix} 1 & 1 \\ 0 & 1 \end{bmatrix} \times \begin{bmatrix} 2 & 0 \\ 3 & 4 \end{bmatrix} \times \begin{bmatrix} 0 & 0 \\ 1 & 1 \end{bmatrix} = \begin{bmatrix} 9 & 4 \\ 7 & 4 \end{bmatrix}$$

```
>>> A=np.array([[1,1],[0,1]])
>>> B=np.array([[2,0],[3,4]])
>>> C=np.array([[1,0],[1,1]])
>>> np.matmul(np.matmul(A,B),C)
array([[9, 4],
       [7, 4]])
>>> A@B@C
array([[9, 4],
       [7, 4]])
```



■ 矩阵运算——转置和求逆

□ 矩阵转置——np.transpose()

```
>>>np.transpose(A)
array([[1, 0],
       [1, 1]])

>>>np.transpose(B)
array([[2, 3],
       [0, 4]])
```

□ 矩阵求逆——np.linalg.inv ()

```
>>>np.linalg.inv(A)
array([[ 1., -1.],
       [ 0.,  1.]])

>>>np.linalg.inv(B)
array([[ 0.5,  0. ],
       [-0.375,  0.25]])
```



■ 数组元素间的运算

函 数	功能描述
numpy.sum()	计算所有元素的和
numpy.prod()	计算所有元素的乘积
numpy.diff()	计算数组的相邻元素之间的差
np.sqrt()	计算各元素的平方根
np.exp()	计算各元素的指数值
np.abs()	取各元素的绝对值



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□ **sum()**——对数组中所有元素求和

```
>>>a=np.arange(4)
array([0, 1, 2, 3])

>>>np.sum(a)
6
```

```
>>>b=np.arange(12).reshape(3,4)
array([[ 0,  1,  2,  3],
       [ 4,  5,  6,  7],
       [ 8,  9, 10, 11]])

>>>np.sum(b)
66
```



□ 按行求和&按列求和

- **轴** (axes) : 数组中的**每一个维度**被称为一个**轴**
- **秩** (rank) : 轴的个数

axis=0 →

0	1	2	3
---	---	---	---

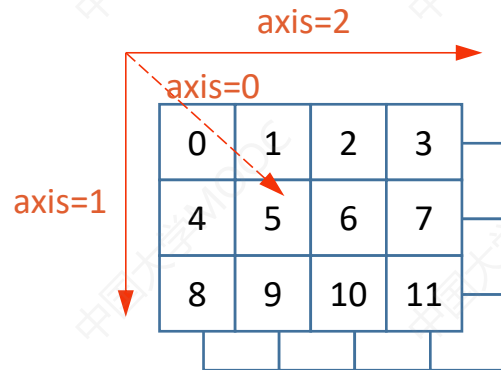
rank=1

axis=1 →

0	1	2	3
4	5	6	7
8	9	10	11

axis=0 ↓

rank=2



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□ 一维数组 (rank=1)

shape: (4,)

0	1	2	3
---	---	---	---

~~axis=0~~

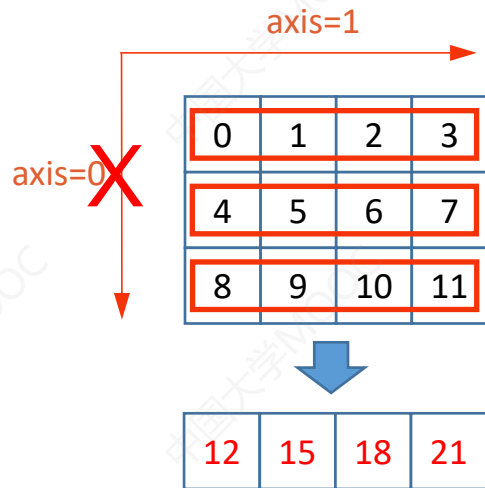
```
>>>a=np.arange(4)
>>>a
array([0, 1, 2, 3])
>>>np.sum(a)
```

6



5.3 数组运算

□ 二维数组 (rank=2)



```
>>>b=np.arange(12).reshape(3,4)
>>>b
array([[ 0,  1,  2,  3],
       [ 4,  5,  6,  7],
       [ 8,  9, 10, 11]])

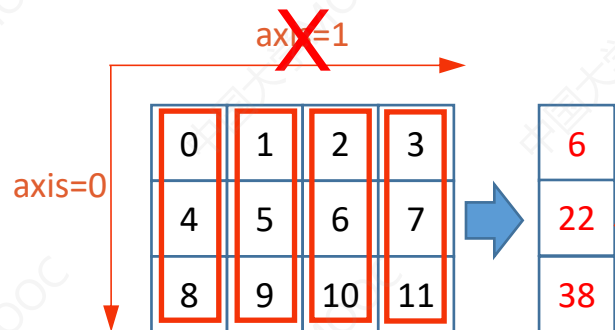
>>>np.sum(b,axis=0)
array([12, 15, 18, 21])

>>>np.sum(b,axis=1)
array([ 6, 22, 38])
```



5.3 数组运算

□ 二维数组 (rank=2)



```
>>>b=np.arange(12).reshape(3,4)
>>>b
array([[ 0,  1,  2,  3],
       [ 4,  5,  6,  7],
       [ 8,  9, 10, 11]])

>>>np.sum(b,axis=0)
array([12, 15, 18, 21])

>>>np.sum(b,axis=1)
array([ 6, 22, 38])
```



5.3 数组运算

三维数组 (rank=3)

axis = 0, 1, 2

```
>>>t=np.arange(24).reshape(X,3,4)
>>>t
array([[[ 0,  1,  2,  3],
        [ 4,  5,  6,  7],
        [ 8,  9, 10, 11]],
       [[12, 13, 14, 15],
        [16, 17, 18, 19],
        [20, 21, 22, 23]]])
```

```
>>>np.sum(t,axis=0)
array([[12, 14, 16, 18],
       [20, 22, 24, 26],
       [28, 30, 32, 34]])

>>>print(np.sum(t,axis=1)
array([[12, 15, 18, 21],
       [48, 51, 54, 57]])

>>>np.sum(t,axis=2)
array([[ 6, 22, 38],
       [54, 70, 86]])
```



5.3 数组运算

三维数组 (rank=3)

axis = 0, 1, 2

```
>>>t=np.arange(24).reshape(2,3,4)
>>>t
array([[[ 0,  1,  2,  3],
        [ 4,  5,  6,  7],
        [ 8,  9, 10, 11],
        [12, 15, 18, 21],
        [16, 17, 18, 19],
        [20, 21, 22, 23]]])
```

48, 51, 54, 57

```
>>>np.sum(t,axis=0)
array([[12, 14, 16, 18],
       [20, 22, 24, 26],
       [28, 30, 32, 34]])

>>>print(np.sum(t,axis=1))
array([[12, 15, 18, 21],
       [48, 51, 54, 57]])

>>>np.sum(t,axis=2)
array([[ 6, 22, 38],
       [54, 70, 86]])
```



5.3 数组运算

三维数组 (rank=3)

axis = 0, 1, 2

```
>>>t=np.arange(24).reshape(2,3,4)
>>>t
array([[[ 0,  1,  2,  3],  6
        [ 4,  5,  6,  7], 22
        [ 8,  9, 10, 11]], 38

       [[12, 13, 14, 15], 54
        [16, 17, 18, 19], 70
        [20, 21, 22, 23]]], 86)
```

```
>>>np.sum(t,axis=0)
array([[12, 14, 16, 18],
       [20, 22, 24, 26],
       [28, 30, 32, 34]])

>>>print(np.sum(t,axis=1)
array([[12, 15, 18, 21],
       [48, 51, 54, 57]])

>>>np.sum(t,axis=2)
array([[ 6, 22, 38],
       [54, 70, 86]])
```



5.3 数组运算

□ 四维数组 (rank=4)

axis = 0, 1, 2, 3
t.shape: (5,10,30, 5)

np.sum(t,axis=0) (10,30, 5)

np.sum(t,axis=1) (5,30, 5)



■ 数组元素间的运算

函 数	功能描述
numpy.sum()	计算所有元素的和
numpy.prod()	计算所有元素的乘积
numpy.diff()	计算数组的相邻元素之间的差
np.sqrt()	计算各元素的平方根
np.exp()	计算各元素的指数值
np.abs()	取各元素的绝对值



□ sqrt()函数实例

```
>>> d = np.logspace(1,4,4,base=2)
>>> d
array([ 2.,  4.,  8., 16.])

>>> np.sqrt(d)
array([ 1.41421356,  2.,  2.82842712,  4.])
```



■ 数组堆叠运算

```
np.stack( (数组1, 数组2,...) , axis)
```

一维数组

x

1	2	3
---	---	---

y

4	5	6
---	---	---

shape=(3,)

二维数组

axis=0

1	2	3
4	5	6

shape=(2, 3)

axis=1

1	4
2	5
3	6

shape=(3, 2)



□ 一维数组堆叠运算

```
>>> x = np.array([1, 2, 3])      #创建一维数组x
>>> y = np.array([4, 5, 6])      #创建一维数组y

>>> np.stack((x, y), axis=0)      #在轴=0上堆叠
array([[1, 2, 3],
       [4, 5, 6]])

>>> np.stack((x, y), axis=1)      #在轴=1上堆叠
array([[1, 4],
       [2, 5],
       [3, 6]])
```



□ 实例

```
area=[137.97,104.50,100.00,124.32,79.20,99.00,124.00,114.00,  
      106.69,138.05,53.75,46.91,68.00,63.02,81.26,86.21]  
room=[3,2,2,3,1,2,3,2,2,3,1,1,1,1,2,2]  
b0 = np.ones(16)  
  
np.stack((area,room,b0), axis = 1)
```

执行NumPy函数前，首先**自动**
把Python列表转换为NumPy数组，**和数据类型转换**，然后再
进行堆叠

a: Python列表，数据元素为浮点数
room: Python列表，数据元素为整数
b0: NumPy数组，全部元素为1



□ 实例

```
area=[137.97,104.50,100.00,124.32,79.20,99.00,124.00,114.00,  
      106.69,138.05,53.75,46.91,68.00,63.02,81.26,86.21]  
room=[3,2,2,3,1,2,3,2,2,3,1,1,1,1,2,2]  
b0 = np.ones(16)  
  
np.stack((area,room,b0), axis = 1)
```

axis=1 $\xrightarrow{\text{堆叠}}$ (16,3)

```
array([[137.97,  3. ,  1. ],  
       [104.5 ,  2. ,  1. ],  
       [100. ,  2. ,  1. ],  
       [124.32,  3. ,  1. ],  
       [ 79.2 ,  1. ,  1. ],  
       [ 99. ,  2. ,  1. ],  
       [124. ,  3. ,  1. ],  
       [114. ,  2. ,  1. ],  
       [106.69,  2. ,  1. ],  
       [138.05,  3. ,  1. ],  
       [ 53.75,  1. ,  1. ],  
       [ 46.91,  1. ,  1. ],  
       [ 68. ,  1. ,  1. ],  
       [ 63.02,  1. ,  1. ],  
       [ 81.26,  2. ,  1. ],  
       [ 86.21,  2. ,  1. ]])
```

浮点数数组



□ 二维数组堆叠

```
>>> m = np.array([[1, 2, 3], [4, 5, 6], [7, 8, 9]])
>>> n = np.array([[10, 20, 30], [40, 50, 60], [70, 80, 90]])
>>> m.shape
(3, 3)
>>> n.shape
(3, 3)

>>> np.stack((m, n), axis=0).shape
(2, 3, 3)
>>> np.stack((m, n), axis=1).shape
(3, 2, 3)
>>> np.stack((m, n), axis=2).shape
(3, 3, 2)
```

