#### Overview

Complex indexing operations to access specific elements in an array

Working with boolean array generated using conditions

Introducing arrays with structured data - a precursor to data frames

Working with mismatched arrays using broadcasting rules

Indexing using arrays of indices

Fancy indexing using GDP data

Indexing with boolean arrays generated using specified conditions

Working with structured data in arrays

# Broadcasting

# Allow operations on arrays with mismatched shapes

# Broadcasting

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is "broadcast" across the larger array so that they have compatible shapes.

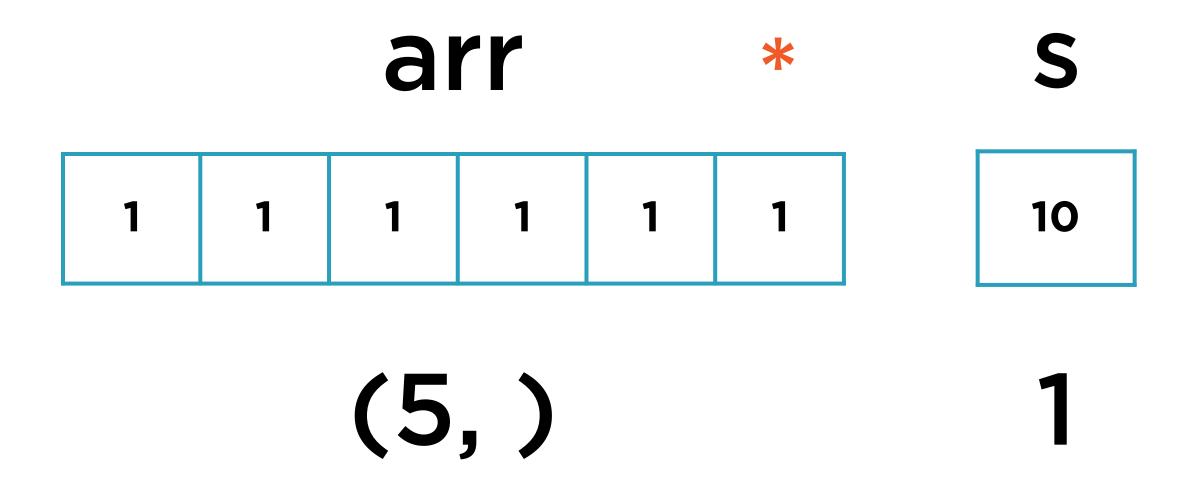
### Compatibility in Broadcasting

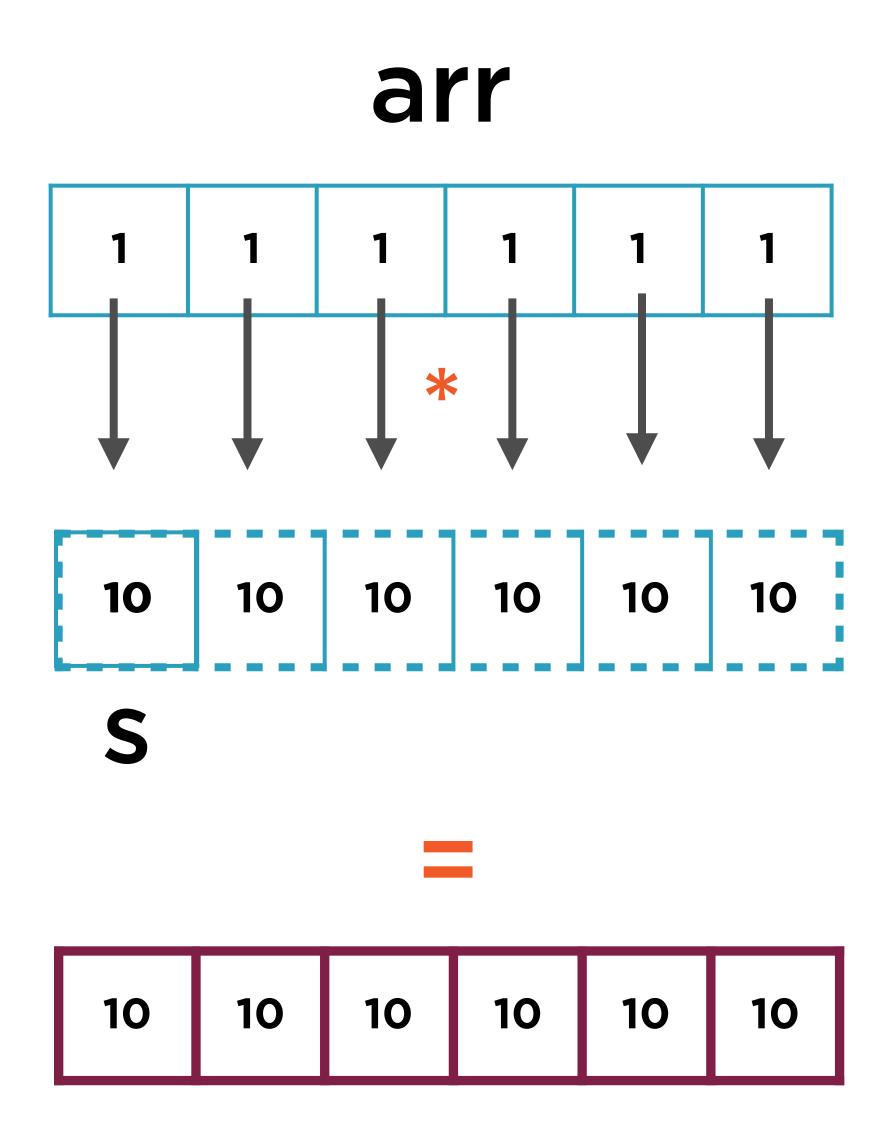
#### **Broadcasting Scalars**

Can always broadcast, independent of the other array in the operation

#### **Broadcasting Arrays**

Can only be broadcast if the shapes of the two arrays match





arr

1	1	1	1	1	1
1	1	1	1	1	1
1	1	1	1	1	1

S

10	10	10	10	10	10
10	10	10	10	10	10
10	10	10	10	10	10

10	10	10	10	10	10
10	10	10	10	10	10
10	10	10	10	10	10

# Broadcasting

Performed on pairs of arrays on an element-by-element basis.

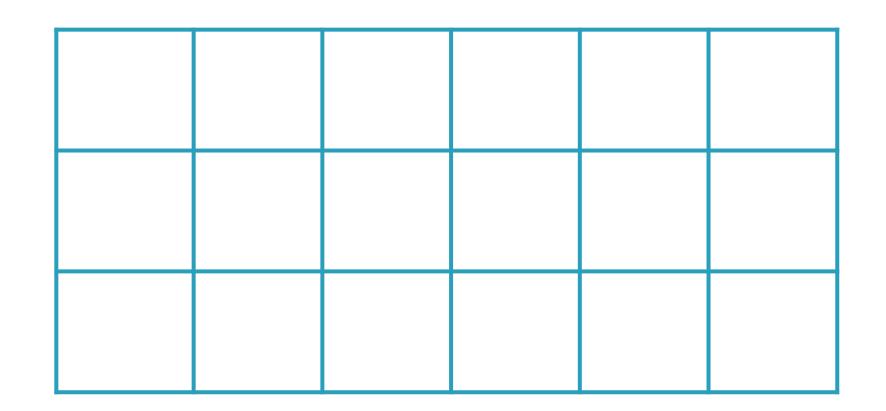
Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is "broadcast" across the larger array so that they have compatible shapes.

Shapes of the two arrays are compared element-wise

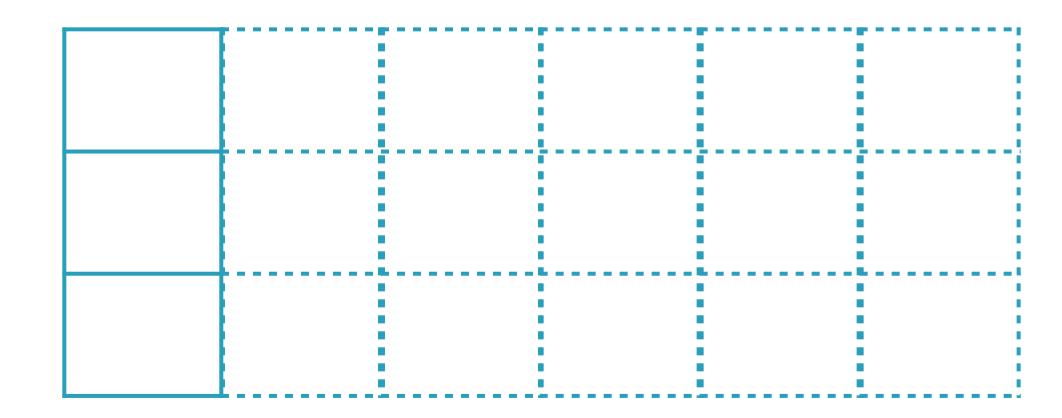
# Broadcasting

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is "broadcast" across the larger array so that they have compatible shapes.

# Broadcasting Constraints

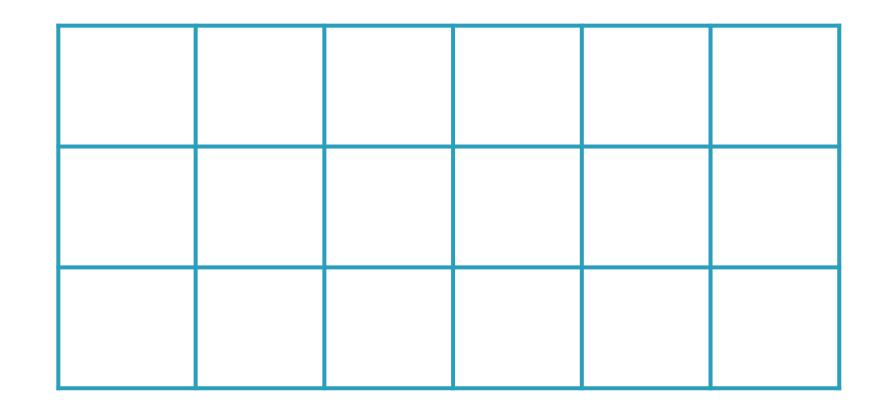


(3, 6)

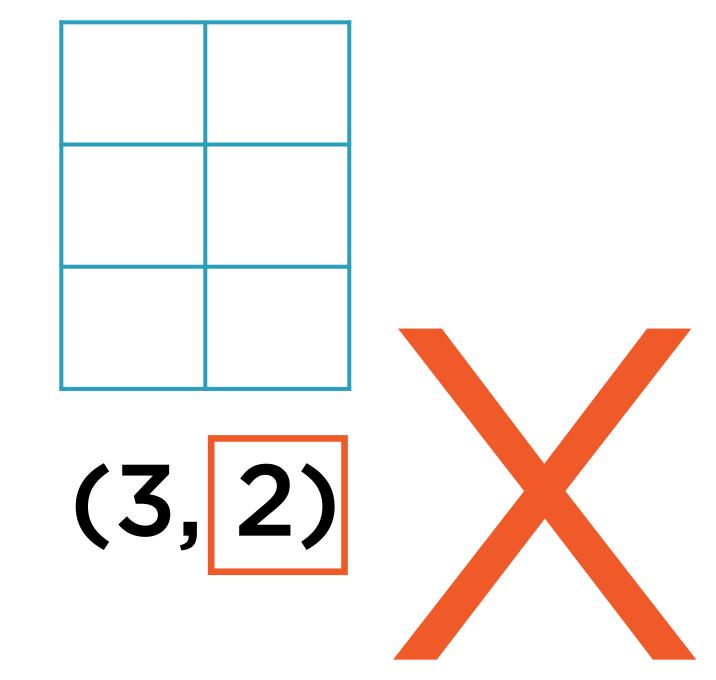


(3, 1)

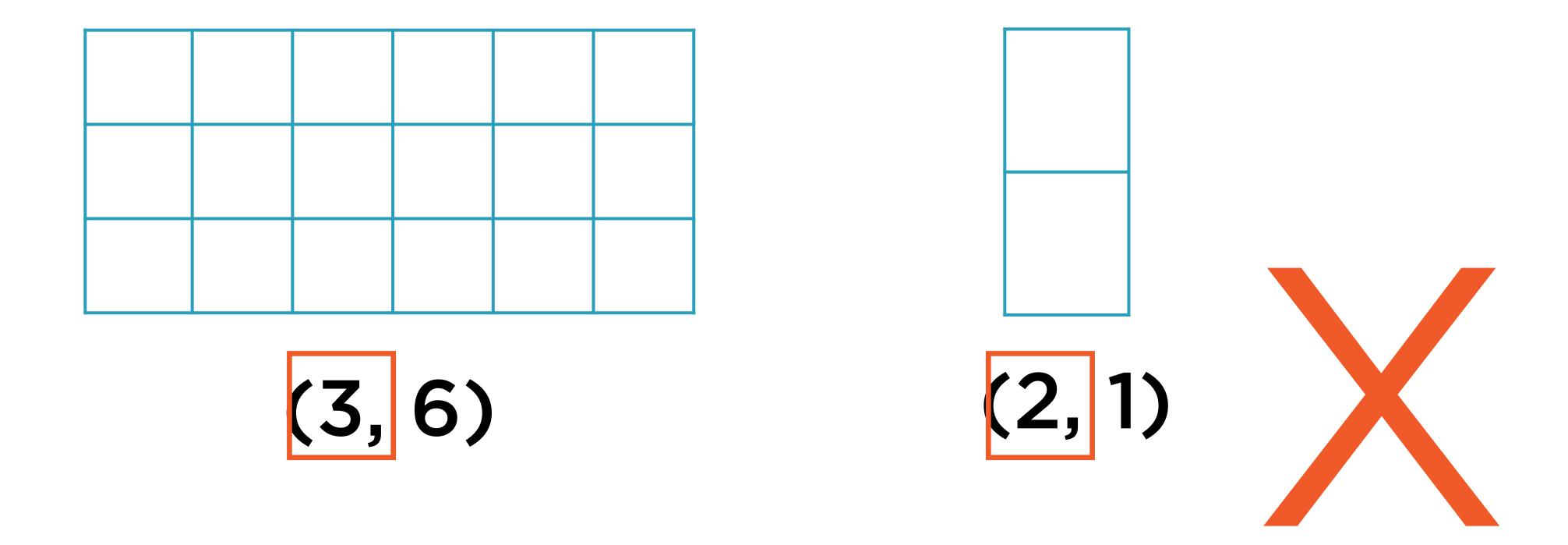
### Broadcasting Constraints



(3, 6)



# Broadcasting Constraints



Shapes of the two arrays are compared element-wise

# Broadcasting

Dimensions are considered in reverse order, starting with the trailing dimensions, and working forward

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is "broadcast" across the larger array so that they have compatible shapes.

Stretch the smaller array by making copies of its elements

# Broadcasting

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is "broadcast" across the larger array so that they have compatible shapes.

No actual copies made; computationally and memory-efficient

# Broadcasting

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is (broadcast) across the larger array so that they have compatible shapes.

No actual copies made; computationally and memory-efficient

# Broadcasting

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is ('broadcast') across the larger array so that they have compatible shapes.

Corresponding dimensions of the arrays must be compatible

# Broadcasting

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is "broadcast" across the larger array so that they have compatible shapes.

#### Corresponding dimensions of the arrays must be compatible

# Broadcasting

Either corresponding dimensions are equal or one of the two dimensions is 1

Describes how NumPy treats arrays with different shapes during arithmetic operations. Subject to certain constraints, the smaller array is "broadcast" across the larger array so that they have compatible shapes.

# Broadcasting



Powerful: Allows arrays of different shapes to be combined

Memory-efficient: Needless copies avoided

Computationally-efficient: Looping ops in C rather than in Python

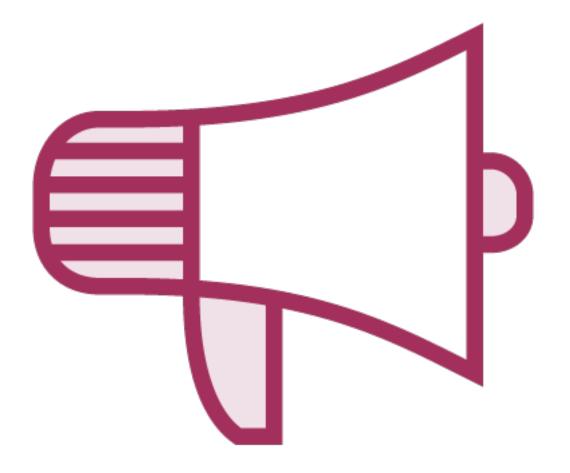
### Compatibility in Broadcasting

#### **Broadcasting Scalars**

Can always broadcast, independent of the other array in the operation

#### **Broadcasting Arrays**

Can only be broadcast if the shapes of the two arrays match



Scalars are easy to broadcast

Just replicate 1 element

Can always broadcast

Independent of the other array

### Broadcasting Arrays



Shapes of the two arrays are compared
Starting from trailing end
Each dimension must be compatible

#### Broadcasting rules

#### Automatic array reshaping

Vector array stacking

#### Histograms

#### Miscellaneous functions

### Summary

Complex indexing operations to access specific elements in an array

Working with boolean array generated using conditions

Introducing arrays with structured data - a precursor to data frames

Working with mismatched arrays using broadcasting rules