

Agenda

Apologies, could not get narration to work. Some thing about windows hardware permission setup.

Will continue try to figure it out for the next lecture, I will do something.

If you have question send me email and I will try to clarify it next week.

Start on the 13 take home labs!!!

Agenda

Announcement

Lecture:

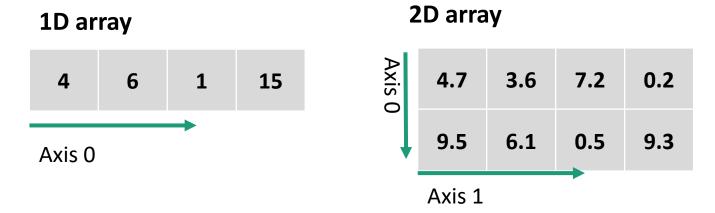
numpy

Testing, Debugging,

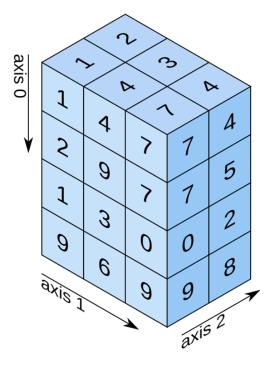
Numpy

Numerical Python

- Homogeneous multidimensional array.
 - Typically tables of numbers
 - Index by tuple of non-negative integers
 - Dimension are referred as axes



3D array



3d figure: https://miro.medium.com/max/1440/1*Ikn1J6siiiCSk4ivYUhdgw.png

Numpy

- Data can be in N dimensional array: 0<N<=infinity
- High performance
- Scientific computing and data analysis
- Fast, space-efficient
- Have tools for reading/writing array data to file
- Have standard mathematical function for fact operation

Installing Numpy

https://scipy.org/install.html

Once numpy is installed you can import the package and use it:

import numpy as np

Numpy Arrays

Creating array/matrix by simply passing a python list or any sequence into the array function

```
import numpy as np #always import numpy
ar=np.array([2,3,4,7])

or
import numpy as np
L1= [2,3,4,7]
ar=np.array(L1)
To access the value, use index just like lists
ar[2] <=result in 4</pre>
```

Numpy indexing 1D

```
ar = 2 3 4 7
```

```
slice is the same ar[0:2] 2 3
```

```
ar[1:] 3 4 7
```

```
Try: ar.max() , ar.min(), ar.sum(),
prod(), mean(), std()
```

arrays

2d Array

```
import numpy as np
data2 = [[1, 4, 3, 2], [5, 6, 7, 8]]
arr2 = np.array(data2)
print(arr2)
Output:
array([[1, 4, 3, 2],
  [5, 6, 7, 8]])
print(arr2.ndim)
Output: 2
print(arr2.shape)
Output: (2, 4)
                                    print(arr2[1][2]) #what is the ouput?
```

2d Array

```
import numpy as np
data2 = [[1, 4, 3, 2], [5, 6, 7, 8]]
arr2 = np.array(data2)
print(arr2)
Output:
array([[1, 4, 3, 2],
  [5, 6, 7, 8]])
print(arr2.ndim)
Output: 2
print(arr2.shape)
Output: (2, 4)
```

```
What is the output when printing the
following:
print(arr2[1,2])
#slice
arr2[1:3]
arr2[0:2,0]
arr2.max(axis=0)
                   #column
arr2.max(axis=1)
                   #row
!n: if you want a copy of the slice, must
make a copy
Arslice=arr2[1:3].copy()
```

2d indexing

Axis 0 column

2

0,2

Axis 1 row

0

1,0

0,0

1,1

0,1

1,2

2

2,0

2,1

2,2

2d indexing

Axis 0

Column

0,1

2

0,2

Axis 1

1

0

1,0

0

0,0

1,1

1,2

Row

2,0

2,1

2,2

Arr[1,2]

Numpy ndarray method

• .ndim

the number of axes (dimensions) of the array.

• .shape

• the dimensions of the array. This is a tuple of integers indicating the size of the array in each dimension. For a matrix with n rows and m columns, shape will be (n,m). The length of the shape tuple is therefore the number of axes, ndim.

• .size

• the total number of elements of the array. This is equal to the product of the elements of shape.

.dtype

- an object describing the type of the elements in the array. One can create or specify dtype's using standard Python types.
- Additionally NumPy provides types of its own. numpy.int32, numpy.int16, and numpy.float64 are some examples.

Numpy ndarray method

.itemsize

• the size in bytes of each element of the array. For example, an array of elements of type float64 has itemsize 8 (=64/8), while one of type complex32 has itemsize 4 (=32/8). It is equivalent to ndarray.dtype.itemsize.

.data

• Normally, we won't need to use this attribute because we will access the elements in an array using indexing facilities.

Transpose .T

arr

1	9
4	2
5	7
3	6

arr.T

9	2	7	6
1	4	5	3

Reshape

Reshape() return a new array with passed in dimensions.

arr

arr.reshape(2,4)

9	2	7	6
1	4	5	3

reshape and arrange()

Reshape() return a new array with passed in dimensions.

Generating array

```
np.arange(15)
 output>>array([ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14])
np.zeros(10)
Output>> array([ 0., 0., 0., 0., 0., 0., 0., 0., 0.])
np.zeros((3, 6))
Output>>
array([[ 0., 0., 0., 0., 0., 0.],
    [0., 0., 0., 0., 0., 0.]
    [0., 0., 0., 0., 0., 0.]
Try:
 onesarray = np.ones((3,6))
```

Generating array

DO NOT assume that **np.empty** will return an array of all zeros. It will return uninitialized garbage values at the memory location that was allocated when creating the array.

Array Creation Functions

Function	Description
array	Convert input data (list, tuple, array, or other sequence type) to an ndarray either by inferring a dtype or explicitly specifying a dtype. Copies the input data by default.
asarray	Convert input to ndarray, but do not copy if the input is already an ndarray
arange	Like the built-in range but returns an ndarray instead of a list.
ones, ones_like	Produce an array of all 1's with the given shape and dtype. ones_like takes another array and produces a ones array of the same shape and dtype.
zeros, zeros_like	Like ones and ones_like but producing arrays of 0's instead
empty, empty_like	Create new arrays by allocating new memory, but do not populate with any values like ones and zeros
eye, identity	Create a square N x N identity matrix (1's on the diagonal and 0's elsewhere)

Data type

Specifying data type for array using dtype

```
arr1 = np.array([1, 2, 3], dtype=np.float64)
arr2 = np.array([1, 2, 3], dtype=np.int32)
```

This allow for more control over how data are store in memory or disk whether they are integers, floating point, Boolean, string, or python objects.

Look up: Numpy data types

3d array

```
arr3d = np.array([[[1, 2, 3], [4, 5, 6]], [[7, 8, 9], [10, 11, 12]]])

arr3d[0]

Output>> #2x3 array

array([[1, 2, 3],
        [4, 5, 6]])
```

!n: for multidimensional arrays, if you omit later indices, the returned object will be a lower-dimensional ndarray consisting of all the data along the higher dimensions

3d array

```
arr3d = np.array([[[1, 2, 3], [4, 5, 6]], [[7, 8, 9], [10, 11, 12]]])
arr3d
Output>> # 2x2x3 array
array([[[ 1, 2, 3],
    [4, 5, 6]],
    [[7, 8, 9],
    [10, 11, 12]])
```

Matrix operations

All Matrix operations are support by numpy:

Arithmetic operators on arrays apply *elementwise*. A new array is created and filled with the result.

```
a = np.array([20,30,40,50])
b = np.arange(4)
print(b)
>>array([0, 1, 2, 3])
c = a-b
print(c)
array([20, 29, 38, 47])
print(b**2)
array([0, 1, 4, 9])
```

Matrix operations

All Matrix operations are support by numpy:

Arithmetic operators on arrays apply *elementwise*. A new array is created and filled with the result.

Matrix operations

```
a = np.array([20,30,40,50])
print(10*np.sin(a))
array([9.12945251, -9.88031624, 7.4511316, -2.62374854])
print(a<35)
array([True, True, False, False])
```

Operation:

```
A = np.array([[1,1],
              [0,1]])
B = np.array([[2,0],
              [3,4]])
A * B
                        # elementwise product
output>>
      array([[2, 0],
             [0, 4]]
```

Operation: product

A = np.array([[1,1],

```
A.dot(B) # another matrix product output>> array([[5, 4], [3, 4]])
```

Operation: axis

```
b = np.arange(12).reshape(3,4)
print(b)
Output>>
      array([[ 0, 1, 2, 3],
            [4, 5, 6, 7],
            [8, 9, 10, 11]])
                             # sum of each column
b.sum(axis=0)
Output>> array([12, 15, 18, 21])
```

Operation: axis

```
# min of each row
b.min(axis=1)
Output>>
      array([0, 4, 8])
b.cumsum(axis=1)
                                # cumulative sum along each row
output>>
      array([[ 0, 1, 3, 6],
            [4, 9, 15, 22],
            [8, 17, 27, 38]])
```

Resize

```
given a is already define:
a
output>>
array([[3., 7., 3., 4.],
    [1., 4., 2., 2.],
    [7., 2., 4., 9.]])
a.resize((2,6))
print(a)
array([[3., 7., 3., 4., 1., 4.],
    [2., 2., 7., 2., 4., 9.]])
```

resize() mutate the current array
Unlike reshape() which return a new array

Numpy: Additional resource

https://numpy.org/devdocs/user/quickstart.html#

https://scipy-lectures.org/intro/numpy/operations.html

• https://www.oreilly.com/library/view/python-for-data/9781449323592/ch04.html



TESTING, DEBUGGING, EXCEPTIONS, ASSERTIONS



WE AIM FOR HIGH QUALTIY – AN ANALOGY WITH SOUP

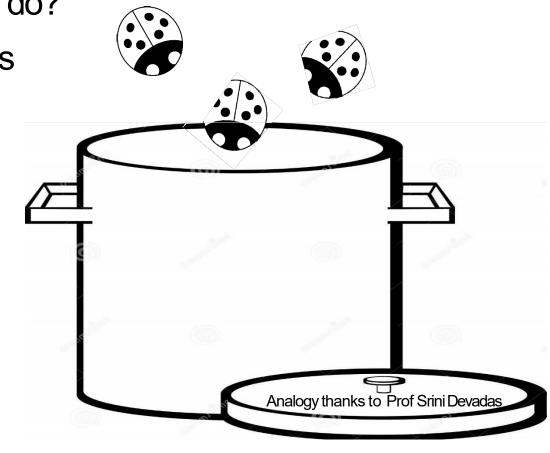
You are making soup but bugs keep falling in from the

ceiling. What do you do?

check soup for bugs

testing

- keep lid closed
 - defensive programming
- clean kitchen
 - eliminate source of bugs



DEFENSIVE PROGRAMMING

- Write specifications for functions
- Modularize programs
- Check conditions on inputs/outputs (assertions)

TESTING/VALIDATION

- Compare input/output pairs to specification
- "It's not working!"
- "How can I break my program?"

DEBUGGING

- Study events leading up to an error
- "Why is it notworking?"
- "How can I fix my program?"

SET YOUSELF UP FOR EASY TESTING AND DEBUGGING

- from the start, design code to ease this part
- break program up into modules that can be tested and debugged individually
- document constraints on modules
 - what do you expect the input to be?
 - what do you expect the output to be?
- document assumptions behind code design

WHEN ARE YOU READY TO TEST?

- ensure code runs
 - remove syntax errors
 - remove static semantic errors
 - Python interpreter can usually find these for you
- have a set of expected results
 - an input set
 - for each input, the expected output

CLASSES OF TESTS

Unit testing

- validate each piece of program
- testing each function separately

Regression testing

- add test for bugs as you find them
- catch reintroduced errors that were previously fixed

Integration testing

- does overall program work?
- tend to rush to do this

TESTING APPROACHES

• intuition about natural boundaries to the problem

```
def is_bigger(x, y):
    """ Assumes x and y are ints
    Returns True if y is less than x, else False """
```

- can you come up with some natural partitions?
- if no natural partitions, might do random testing
 - probability that code is correct increases with more tests
 - better options below
- black box testing
 - explore paths through specification
- glass box testing
 - explore paths through code

BLACK BOX TESTING

```
def sqrt(x, eps):
    """ Assumes x, eps floats, x >= 0, eps > 0
    Returns res such that x-eps <= res*res <= x+eps """</pre>
```

- designed without looking at the code
- can be done by someone other than the implementer to avoid some implementer biases
- testing can be reused if implementation changes
- paths through specification
 - build test cases in different natural space partitions
 - also consider boundary conditions (empty lists, singleton list, large numbers, small numbers)

BLACK BOX TESTING

```
def sqrt(x, eps):
    """ Assumes x, eps floats, x >= 0, eps > 0
    Returns res such that x-eps <= res*res <= x+eps """</pre>
```

CASE	x	eps
boundary	0	0.0001
perfect square	25	0.0001
less than 1	0.05	0.0001
irrational square root	2	0.0001
extremes	2	1.0/2.0**64.0
extremes	1.0/2.0**64.0	1.0/2.0**64.0
extremes	2.0**64.0	1.0/2.0**64.0
extremes	1.0/2.0**64.0	2.0**64.0
extremes	2.0**64.0	2.0**64.0

GLASSBOX TESTING

- use code directly to guide design of test cases
- called path-complete if every potential path through code is tested at least once
- what are some drawbacks of this type of testing?
 - can go through loops arbitrarily many times
 - missing paths
- exercise all parts of a conditional body of loop executed exactly once body of loop executed more than once guidelines loop not entered same as for loops, cases branches that catch all ways to exit for loops while loops 1000

GLASSBOX TESTING

```
def abs(x):
    """ Assumes x is an int
    Returns x if x>=0 and -x otherwise """
    if x < -1:
        return -x
    else:
        return x</pre>
```

- a path-complete test suite could miss a bug
- path-complete test suite: 2 and -2
- but abs(-1) incorrectly returns -1
- should still test boundary cases

DEBUGGING

- steep learning curve
- goal is to have a bug-free program
- tools
 - built in to IDLE and Anaconda
 - Python Tutor
 - print statement
 - use your brain, be systematic in your hunt

PRINT STATEMENT

- good way to test hypothesis
- when to print
 - enter function
 - parameters
 - function results
- use bisection method
 - put print halfway in code
 - decide where bug may be depending on values

DEBUGGING STEPS

- study program code
 - don't ask what is wrong
 - ask how did I get the unexpected result
 - is it part of a family?

scientific method

- study available data
- form hypothesis
- repeatable experiments
- pick simplest input to testwith

ERROR MESSAGES - EASY

trying to access beyond the limits of a list

```
test = [1,2,3] then test [4] \rightarrow IndexError
```

trying to convert an inappropriate type

```
int(test) → TypeError
```

referencing a non-existent variable

```
a → NameError
```

mixing data types without appropriate coercion

```
'3'/4 → TypeError
```

forgetting to close parenthesis, quotation, etc.

```
a = len([1,2,3])
print(a) \rightarrow SyntaxError
```