

COMP110: Principles of Computing

7: Data structures

Learning outcomes

- ▶ **Explain** the difference between pass-by-value and pass-by-reference
- ▶ **Distinguish** the basic data structures available in Python
- ▶ **Determine** the complexity of accessing and manipulating data in these data structures
- ▶ **Choose** the correct data structure for a given task

Worksheet D

- ▶ Data structures
- ▶ Due in class on **Monday 7th November** (next week)

Pass by reference



References

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- ▶ Our picture of a variable: a labelled box containing a value
- ▶ For “plain old data” (e.g. numbers), this is accurate
- ▶ For **objects** (i.e. instances of classes), variables actually hold **references** (a.k.a. **pointers**)
- ▶ It is possible (indeed common) to have **multiple references** to the same underlying object

The wrong picture

```
class Thing:
    def __init__(self,
                  a, b):
        self.a = a
        self.b = b
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y = Thing(50, 60)
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Socrative room code: FALCOMPED

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double(a)  
print a
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`double` does not actually do anything, as `x` is just a local copy of whatever is passed in!

Pass by reference

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However, instances are passed by **reference**

```
class Box:
    def __init__(self, v):
        self.value = v

def double(x):
    x.value *= 2

a = Box(7)
double(a)
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class Box:
    def __init__(self, v):
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def double(x):
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double(a)
print a.value
```

`double` now has an effect, as `x` gets a reference to the `Box` instance

Lists are objects too

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```
a = ["Hello"]  
b = a  
b.append("world")  
print a # ["Hello", "world"]
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... which means you should be careful when passing lists into functions, because the function might actually change the list!

Basic containers in Python



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- ▶ Blocks can be allocated and deallocated at will, but can **never grow or shrink**

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- ▶ Containers are an **abstraction**
 - ▶ Hide the details of memory allocation, and allow the programmer to write simpler code
- ▶ Containers are an **encapsulation**
 - ▶ Bundle together the data's representation in memory along with the algorithms for accessing it

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- ▶ E.g. if the array starts at address 1000 and each element is 4 bytes, the 3rd element is at address $1000 + 4 \times 3 = 1012$
- ▶ Accessing an array element is **constant time** $O(1)$

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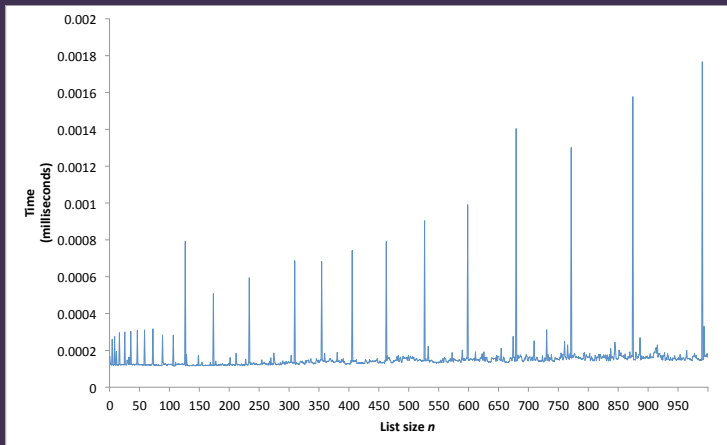
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- ▶ When the list needs to change size, it **creates** a new array, **copies** the contents of the old array, and **deletes** the old array
- ▶ Implementation details: <http://www.laurentluce.com/posts/python-list-implementation/>

Time taken to append an element to a list of size n



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 - ▶ Can't just insert new bytes into a memory block — need to move all subsequent list elements to make room
- ▶ Similarly, **deleting** anything other than the last element is **linear time**

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- ▶ Create tuples with `()`, just as you create lists with `[]`
 - ▶ Exception: a single element tuple is created as `(foo,)` because `(foo)` would be interpreted as a bracketed expression
- ▶ Can often omit the parentheses entirely, e.g.

```
my_tuple = 1,2,3
```

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- Unpacking requires the number of elements to match exactly — if `foo` has more than 4 elements, the code on the left will give an error

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temp = a  
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- ▶ This isn't changing the string, it's creating a new one and throwing the old one away!
- ▶ Hence building a long string by appending can be slow (appending strings is $O(n)$)

Dictionaries

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- ▶ A dictionary maps **keys** to **values**
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 - ▶ Values can be anything (including dictionaries or other containers)
- ▶ A dictionary is implemented as a **hash table** (see Session 5)

Using dictionaries

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Create them using {}:

```
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Access values using []:

```
print age["Alice"]    # prints 23
age["Bob"] = 40        # overwriting an existing item
age["Denise"] = 21     # adding a new item
```

Iterating over dictionaries

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Iterating over a dictionary gives the **keys**:

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for x in age:  
    print x    # prints Alice, Bob, Charlie
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Use `iteritems` to get **key,value** pairs:

```
for key, value in age.items():  
    print key, "is", age, "years old"
```

Dictionaries are unordered

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What does this print?

```
square_root = {}  
for i in xrange(30):  
    square_root[i*i] = i  
  
for key, value in square_root.iteritems():  
    print "The square root of", key, "is", value
```

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Dictionaries are **unordered** — never rely on the order of their elements, because the order isn't guaranteed!

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Operation	List	Set
Add element	Append: $O(1)$ Insert: $O(n)$	$O(1)$
Delete element	$O(n)$	$O(1)$
Contains element?	$O(n)$	$O(1)$

2-dimensional arrays



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Common problem: we want to represent a **2-dimensional array** of values (i.e. a grid)

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$$\begin{array}{cccc} V_{0,0} & V_{1,0} & \cdots & V_{w-1,0} \\ V_{0,1} & V_{1,1} & \cdots & V_{w-1,1} \\ \vdots & \vdots & \ddots & \vdots \\ V_{0,h-1} & V_{1,h-1} & \cdots & V_{w-1,h-1} \end{array}$$

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- ▶ E.g. $w = 5, h = 4$:

0	1	2	3	4
5	6	7	8	9
10	11	12	13	14
15	16	17	18	19

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 - ▶ Each element of the “outer” list represents a column of the array
- ▶ The element in column x row y is accessed by `list[x][y]`, i.e. the y th element of the x th column

Approach 3: dictionary

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Approach 3: dictionary

- ▶ Represent the array as a dictionary whose keys are (x, y) tuples
- ▶ The element in column x row y is accessed by `list[x, y]`

Approach 4: NumPy array

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Approach 4: NumPy array

- ▶ Requires NumPy or SciPy, and can only store numeric types
- ▶ However, highly optimised for intensive calculations (e.g. “tinkering” with image pixel colours...?)

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There is no single “best” approach — it depends how you use it

More data structures



Stacks and queues

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- ▶ A **queue** is a **first-in first-out (LIFO)** data structure
- ▶ Items can be **enqueued** to the **back** of the queue

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- ▶ Items can be **pushed** to the **top** of the stack
- ▶ Items can be **popped** from the **top** of the stack



- ▶ A **queue** is a **first-in first-out (LIFO)** data structure
- ▶ Items can be **enqueued** to the **back** of the queue
- ▶ Items can be **dequeued** from the **front** of the queue

Stacks and queues in Python

Stacks and queues in Python

- ▶ Stacks can be implemented efficiently as lists

Stacks and queues in Python

- ▶ Stacks can be implemented efficiently as lists
- ▶ Queues can be implemented as lists, but not efficiently

Stacks and queues in Python

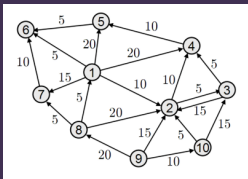
- ▶ Stacks can be implemented efficiently as lists
- ▶ Queues can be implemented as lists, but not efficiently
- ▶ `deque` (from the `collections` module) implements an efficient **double-ended queue**

Stacks and queues in Python

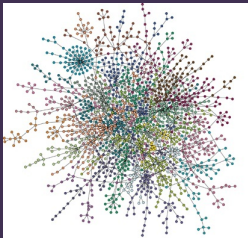
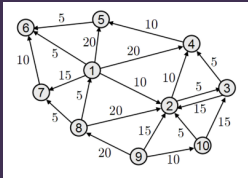
- ▶ Stacks can be implemented efficiently as lists
- ▶ Queues can be implemented as lists, but not efficiently
- ▶ `deque` (from the `collections` module) implements an efficient **double-ended queue**
- ▶ Inserting and removing elements from the start and end of a `deque` is $O(1)$

Graphs

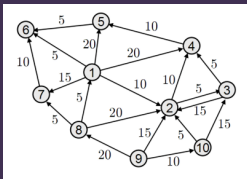
Graphs



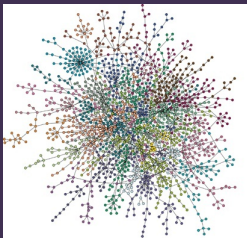
► A **graph** is defined by:



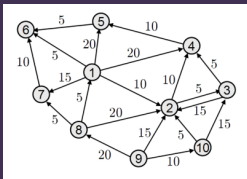
Graphs



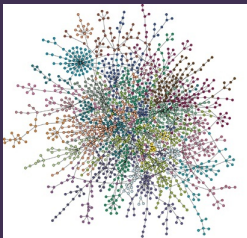
- ▶ A **graph** is defined by:
 - ▶ A collection of **nodes** or **vertices** (points)



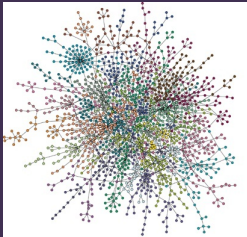
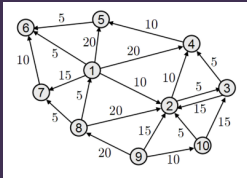
Graphs



- ▶ A **graph** is defined by:
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 - ▶ A collection of **edges** or **arcs** (undirected lines or directed arrows between points)



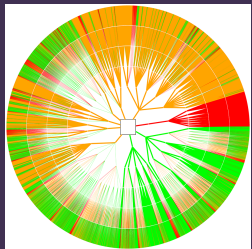
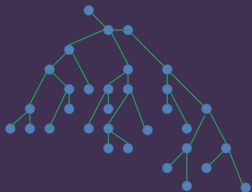
Graphs



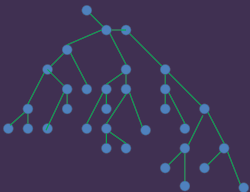
- ▶ A **graph** is defined by:
 - ▶ A collection of **nodes** or **vertices** (points)
 - ▶ A collection of **edges** or **arcs** (undirected lines or directed arrows between points)
- ▶ Often used to model **networks** (e.g. social networks, transport networks, game levels, finite state automata, ...)

Trees

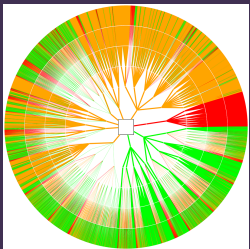
Trees



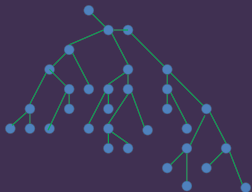
Trees



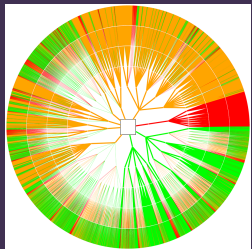
- A **tree** is a special type of directed graph where:



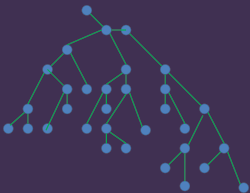
Trees



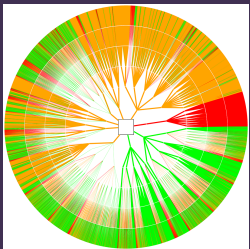
- ▶ A **tree** is a special type of directed graph where:
 - ▶ One node (the **root**) has no incoming edges



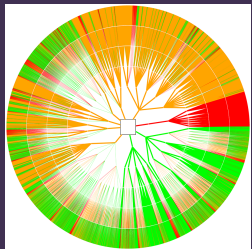
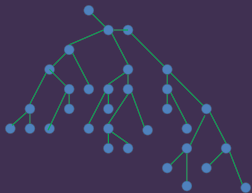
Trees



- ▶ A **tree** is a special type of directed graph where:
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 - ▶ All other nodes have exactly 1 incoming edge

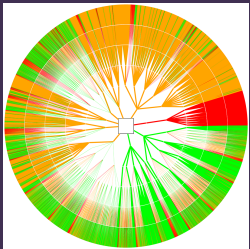
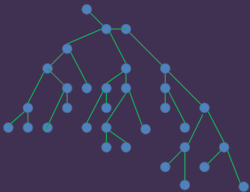


Trees



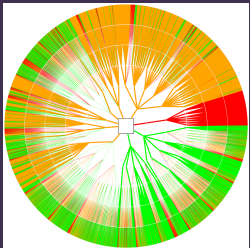
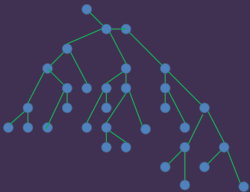
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Trees



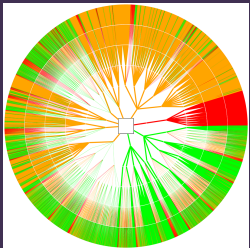
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Trees



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Trees



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- ▶ Edges go from **parent** to **child**
 - ▶ All nodes except the root have exactly one parent
 - ▶ Nodes can have 0, 1 or many children
- ▶ Used to model **hierarchies** (e.g. file systems, object inheritance, scene graphs, state-action trees, ...)

*"Smart data structures and dumb code works a lot better
than the other way around."*
— Eric S. Raymond