

# LIST ME YOUR VIRTUES

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PYLONDINIUM 2018



OH, HELLO! I'M MAI  
& WE ARE GOING TO  
HAVE FUN LEARNING

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**HAPPY  
PROUD  
JUNE**



# RHODES KNOWS IT BETTER



**PYCON 2014**

MONTREAL • APRIL 9-17

**All Your Ducks In A Row: Data  
Structures in the Standard Library  
and Beyond**

**Presented By  
Brandon Rhodes**



heroku

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the open cloud company

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All your ducks in a row

Brandon Rhodes

PyCon 2014



“THE LIST IS  
THE MOST DANGEROUS  
DATA STRUCTURE”

Brandon Rhodes



**WHAT?!**

#DragRace  
Season Premiere

**VH1**

1.

# THE LIST CONSTRUCTOR

# LISTS 101

- \_ A list is a data structure that contains a sequence of elements of the same type ordered.
- \_ Lists are a mutable object.
- \_ The constructor of a list:

```
list([iterable_object])
```

```
[]
```



## OK, GOT IT. LET'S CREATE A LIST.

\_ Let's create some lists then:

```
>>> list("hello world")
```

[illegible]

```
>>> [1, 2, 3]
```

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

THERE SHOULD BE ONE  
- AND PREFERABLY ONLY ONE -  
OBVIOUS WAY TO DO IT.

Python zen

# LIST() VS []: THE PYTHONIC WAY

\_ The Pythonic (and fastest) way to do it is using the **[]**

```
>>> timeit("[]")  
0.04296872499980964  
  
>>> timeit("list()")  
0.20007910901040304
```

# LIST() VS [] : LITERALS

\_ List is a built-in object whereas [] is a literal\*. Hence, a list has to look up for its namespace but not the []

```
>>> dis.dis(lambda : [])
1           0 BUILD_LIST           0
           2 RETURN_VALUE

>>> dis.dis(lambda : list())
1           0 LOAD_GLOBAL           0 (list)
           2 CALL_FUNCTION         0
           4 RETURN_VALUE
```

\* A **literal** is a succinct form of writing a built-in object that the parser can recognise easily.

# LIST() VS []: THE NOT SO OBVIOUS BEHAVIOURS

\_ Sometimes the behaviour might not be what we expected

```
>>> list("abc")  
      ["a", "b", "c"]  
  
>>> ["abc"]  
      ["abc"]
```

\_ From the [language definition](#): **list\_display** ::= “[” [starred\_list | comprehension]”]

\_ Also, from the [Python documentation](#): **class list([iterable])**: The constructor builds a list whose items are the same and in the same order as *iterable*'s items.

# LIST() VS []: THE NOT SO OBVIOUS BEHAVIOURS

\_ If *iterable* is already a list, a copy is made and returned using the constructor, but not using the literal.

```
>>> list_1 = [1,2,3]
      [1,2,3]
>>> id(list_1)
      4479653128

>>> list_2 = list(list_1)
      [1,2,3]
>>> id(list_2)
      4473062408
```

```
>>> list_1 = [1,2,3]
      [1,2,3]
>>> id(list_1)
      4479653128

>>> list_2 = [list_1]
      [[1,2,3]]
>>> id(list_2)
      447315328
>>> id(list_2[0])
      4479653128
```



# LIST() VS []: THE NOT SO OBVIOUS BEHAVIOURS

\_ You could overwrite the built-in

```
>>> import builtins
>>> builtins.list = set

>>> list()
set([])

>>> []
[]
```

\_ Shout out to [@pyblogsal](#)

2.

INDEXING  
LISTS

# INDEXING LISTS

\_ An item in a list can be accessed using its index, an integer value that tags each position starting from 0. But we could also access counting backwards.

```
>>> hello_list = list("hello world")
```

0	1	2	3	4	5	6	7	8	9	10
h	e	l	l	o		w	o	r	l	d
-11	-10	-9	-8	-7	-6	-5	-4	-3	-2	-1

```
>>> hello_list[4]  
o
```

```
>>> hello_list[-3]  
r
```

# INDEXING LISTS

- \_ The cost of accessing an item is constant  **$O(1)$** .
- \_ If we have an array where all its elements are the same, it's easy to explain how this can be done.

hello\_list      => 0x00

characters     => 1B \*

i-th character =>  $0x00 + (i * 8b)$

```
>>> hello_list[4]
```

- \_ But lists in Python can have multiple objects, How did Python know where to find the element in  $O(1)$  time?

\* Let's roll with this unicode oversimplification

3.

THE CPYTHON  
LIST

# THE CPYTHON LIST ON BARE METAL

\_ If we create an empty list is not completely empty.

```
>>> len([])
0

>>> import sys
>>> sys.getsizeof([])
64
```



# HOW LISTS ARE IMPLEMENTED

What the [documentation](#) says:

- \_ Python's lists are really variable-length arrays, *not Lisp-style linked lists*.
- \_ The implementation uses a **contiguous array of references to other objects** and keeps a pointer to this array and the array's length in a list head structure.
- \_ When items are appended or inserted, the array of references is resized. *Some cleverness is applied* to improve the performance of appending items repeatedly; when the array must be grown, some extra space is allocated so the next few times don't require an actual resize.

# THE CPYTHON LIST ON BARE METAL

What the code says:

```
typedef struct {  
    // Macro used when declaring new types with a varying length.  
    PyObject_VAR_HEAD;  
    // Vectors of pointers to a list of items.  
    PyObject **ob_item;  
    // Memory allocated.  
    Py_ssize_t allocated;  
} PyListObject;
```

# THE CPYTHON LIST ON BARE METAL

## PyObject\_VAR\_HEAD

reference\_count

```
*type object
```

ob\_size

## \*\*ob\_items

allocated

	reference count	
	address of type	
		3
	array of addresses	
		4

```
type <list>
```

0	address	item 0	→
1	address	item 1	→
2	address	item 2	→
3			

# TEST ME!

```
>>> init_list = [1]

>>> append_list = []
>>> append_list.append(1)

>>> assert sys.getsizeof(list_init) == sys.getsizeof(list_append)
```

# TEST ME!

```
>>> init_list = [1]

>>> append_list = []
>>> append_list.append(1)

>>> assert sys.getsizeof(list_init) == sys.getsizeof(list_append)
-----
AssertionError
```

# TEST ME!

```
>>> init_list = [1]

>>> append_list = []
>>> append_list.append(1)

>>> assert sys.getsizeof(list_init) == sys.getsizeof(list_append)
-----
AssertionError

>>> assert sys.getsizeof(list_init)
72

>>> assert sys.getsizeof(append_list)
96
```





# INIT VS APPEND

\_ **Empty list:** we need 64 B for storing the list data structure

```
>>> sys.getsize([])  
64
```

\_ **List with one element:** in this case we are going to store space for the element as well, 8B for an pointer in a 64b machine.

```
>>> sys.getsize([1])  
72
```

\* [Eli Bendersky](#) explains it deeper in this [Stackoverflow answer](#).

# INIT

```
>>> init_list = [1]
```

## PyObject\_VAR\_HEAD

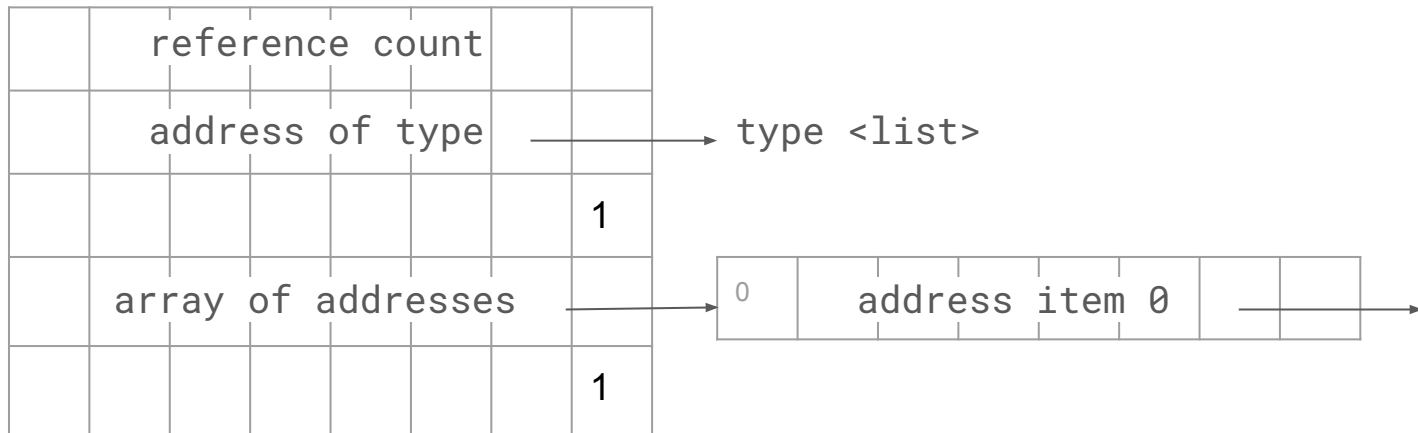
reference\_count

```
*type object
```

ob\_size

## \*\*ob\_items

allocated



# APPEND

\_ **Append an element to a list**: if we want to append an element to an empty list we will need to allocate new memory and here is where the cleverness happens. The amortized cost is  $O(1)$

```
function list_resize:
    input: list_object, new_size
    output: 0 if OK -1 otherwise

    if (allocated >= new_size && new_size >= (allocated << 1))
        // Do not reallocate memory
        return 0;

    // The growth pattern is: 0, 4, 8, 16, 25, 35, 46, ...
    new_allocated = new_size + new_size >> 3 + (new_size < 9 ? 3 : 6);

    // Do not overflow
    if (new_allocated > PY_SIZE_MAX - new_size)
        PyErr_NoMemory(); return -1

    reallocate_each_item()
```

# APPEND

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```
function list_resize:  
    input: list_object, new_size  
    output: 0 if OK -1 otherwise
```

Cleverness! Bypass realloc

```
    if (allocated >= new_size && new_size >= (allocated << 1))  
        // Do not reallocate memory  
        return 0;
```

```
    // The growth pattern is: 0, 4, 8, 16, 25, 35, 46, ...  
    new_allocated = new_size + new_size >> 3 + (new_size < 9 ? 3 : 6);
```

```
    // Do not overflow  
    if (new_allocated > PY_SIZE_MAX - new_size)  
        PyErr_NoMemory(); return -1
```

```
    reallocate_each_item()
```

# INIT VS APPEND

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    // Do not overflow
    if (new_allocated > PY_SIZE_MAX - new_size)
        PyErr_NoMemory(); return -1

    reallocate_each_item()
```

Cleverness! Mild reallocation

# APPEND

## PyObject\_VAR\_HEAD

reference\_count

```
*type object
```

ob\_size

## \*\*ob\_items

allocated

	reference	count		
	address of type			
				0
				0

→ type <list>

## PyObject\_VAR\_HEAD

reference\_count

```
*type object
```

ob\_size

## \*\*ob\_items

allocated

	reference count	
	address of type	
		1
	array of addresses	
		4

```
type <list>
```

0	address item 0						→
1							
2							
3							



4.

LIST OF  
DANGERS



**NO ONE IS SAFE**

# THE ONE-LINER OFFENDERS

Some operations seem to be single operations—hence  $O(1)$ —that are actually operating over multiple items.

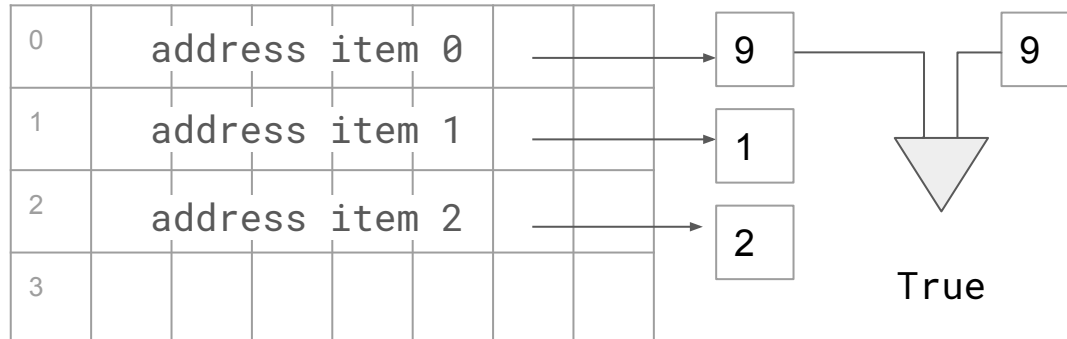
<code>l[i]</code>	$O(1)$		
<code>l[i] = v</code>	$O(1)$		
		<code>l.extend(k)</code>	$O(k)$
<code>append(v)</code>	$O(1)$	<code>append(j)</code>	$O(n)$
<code>insert(len(l), i)</code>	$O(1)$	<code>insert(0, i)</code>	$O(n)$
<code>del l[-1]</code>	$O(1)$	<code>del l[0]</code>	$O(n)$
<code>l.pop()</code>	$O(1)$	<code>l.pop(0)</code>	$O(n)$
<code>v in l</code>	$O(1)$	<code>v in l</code>	$O(n)$

4.1.  
IN

# DANGEROUS OPERATIONS: IN

\_ In order to make sure that the element is in the list we will need to check all the elements.  
Hence, the average cost is  $O(n)$

```
>>> 9 in [9,2,3]
```



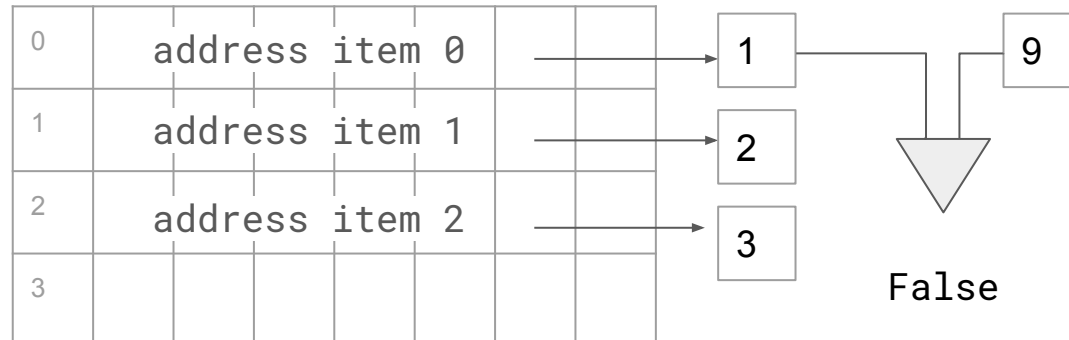
A person with a short, straight white wig and dark eye makeup is looking towards the camera. They are wearing a light purple or lavender halter-neck top with a thick, beaded strap. The background is a dimly lit room with pinkish-red walls. To the right, another person with long dark hair and a tattoo on their shoulder is partially visible.

Party

# DANGEROUS OPERATIONS: IN

\_ In order to make sure that the element is in the list we will need to check all the elements.  
Hence, the average cost is  $O(n)$

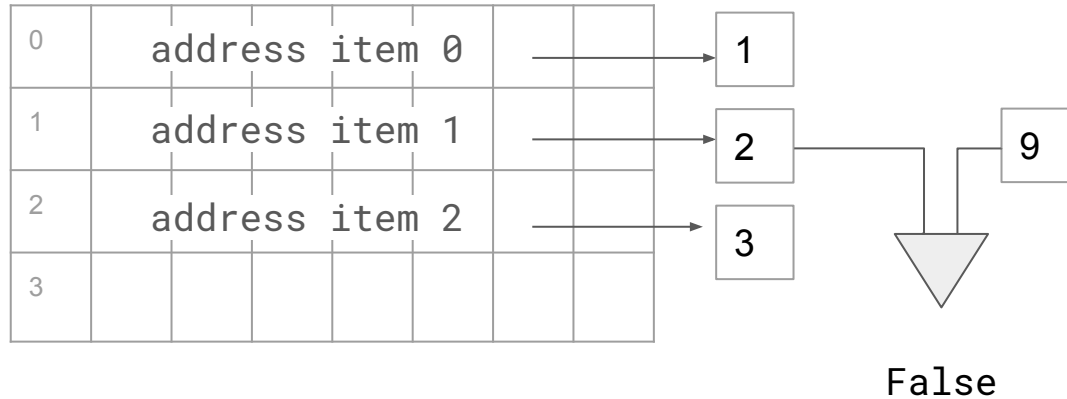
```
>>> 9 in [1,2,3]
```



# DANGEROUS OPERATIONS: IN

\_ In order to make sure that the element is in the list we will need to check all the elements.  
Hence, the average cost is  $O(n)$

```
>>> 9 in [1,2,3]
```

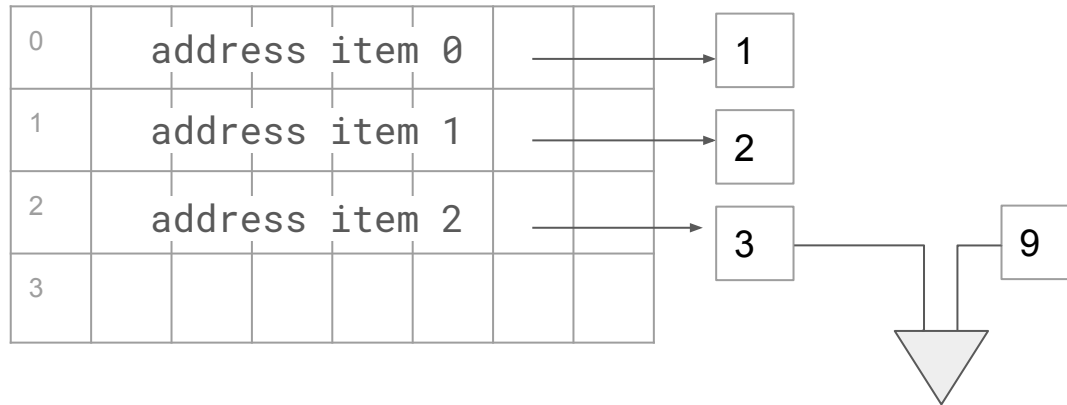




# DANGEROUS OPERATIONS: IN

\_ In order to make sure that the element is in the list we will need to check all the elements.  
Hence, the average cost is  $O(n)$

```
>>> 9 in [1,2,3]
```



False

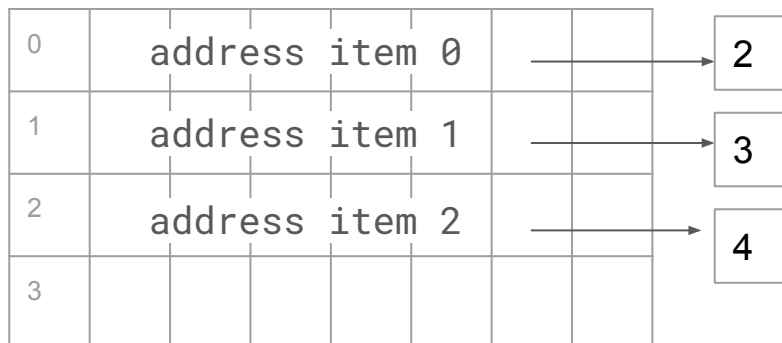
4.2.

INSERT

# DANGEROUS OPERATIONS: INSERT

\_ If we don't insert at the end of the list, the cost of inserting an item  $v$  in position  $p$  is  $O(n)$

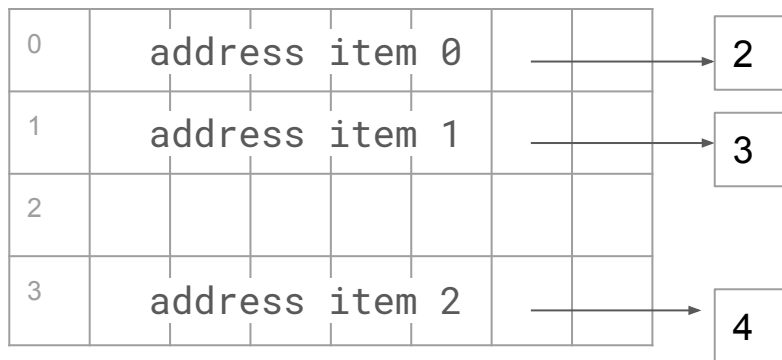
```
>>> ins_list = [2,3,4]
>>> ins_list.insert(1,0)
```



# DANGEROUS OPERATIONS: INSERT

\_ If we don't insert at the end of the list, the cost of inserting an item  $v$  in position  $p$  is  $O(n)$

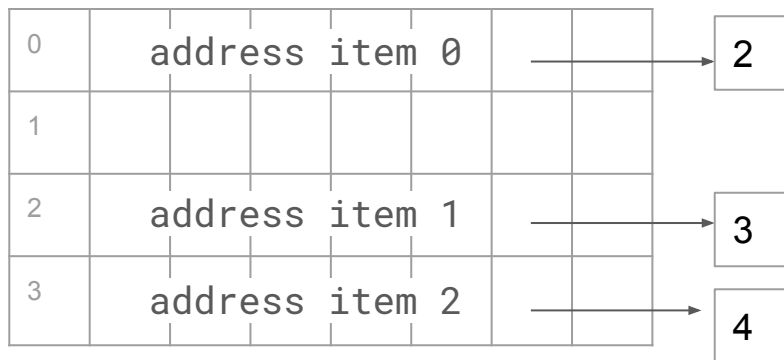
```
>>> ins_list = [2,3,4]
>>> ins_list.insert(1,0)
```



# DANGEROUS OPERATIONS: INSERT

\_ If we don't insert at the end of the list, the cost of inserting an item  $v$  in position  $p$  is  $O(n)$

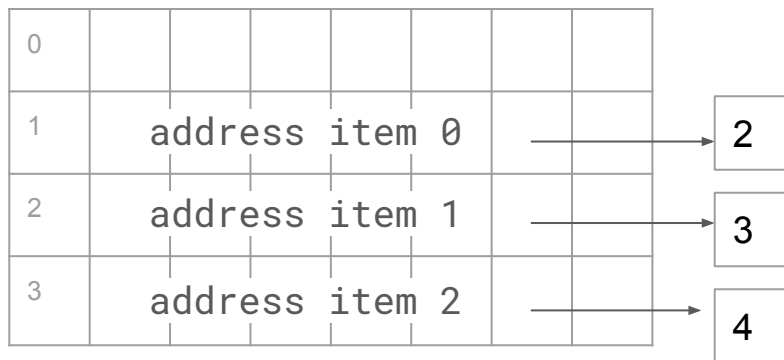
```
>>> ins_list = [2,3,4]
>>> ins_list.insert(1,0)
```



# DANGEROUS OPERATIONS: INSERT

\_ If we don't insert at the end of the list, the cost of inserting an item  $v$  in position  $p$  is  $O(n)$

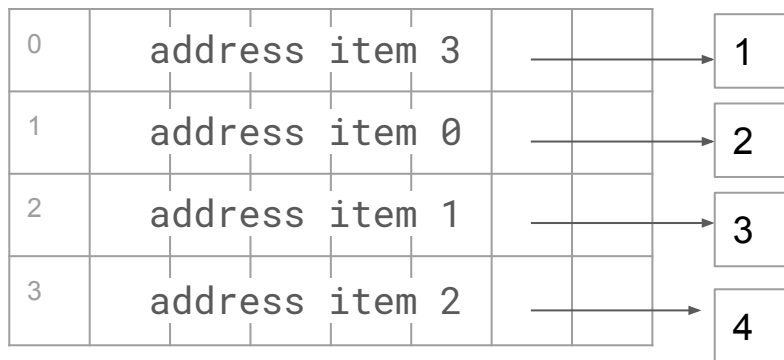
```
>>> ins_list = [2,3,4]
>>> ins_list.insert(1,0)
```



# DANGEROUS OPERATIONS: INSERT

\_ If we don't insert at the end of the list, the cost of inserting an item  $v$  in position  $p$  is  $O(n)$

```
>>> ins_list = [1,3,4]
>>> ins_list.insert(2,0)
```



4.3.

THE SLICING  
OPERATOR :



# THE TERRIFYING SLICING OPERATOR

\_ Slicing is really tricky because it selects a range of items in a sequence and creates a new list, copying all the elements from the slice.

```
>>> sliceable_list = [1, 2, 3, 4, 5, 6]
>>> part_list = sliceable_list[2:4]
>>> part_list
[3, 4]
```

\_ Notation

```
slice := slicing "[" [lower_bound]:[upper_bound] [ ":"[stride]] "]"
```

# THE TERRIFYING SLICING OPERATOR

\_ **Slicing**: creates a new list and copy all the values in the segment from the source list to the new list.

```
function list_slice:
    input: src_list_object, low_offset, high_offset
    output: dst_list_object

    // Find the lower and the high offset if they're undefined.
    // Define the length and create the new list
    len = high_offset - low_offset
    np = new list(len)
    if np == NULL: return NULL

    // Copy items in the new array
    for i, item in enumerate(src_list_object):
        np[i] = item
        increment_reference(item)
```

# THE TERRIFYING SLICING OPERATOR

\_ Slicing allow us to get parts of a list easily.

```
>>> hello_list = list("hello world")

>>> hello_list[4:8]
["o", " ", "w", "o"]

>>> hello_list[6:]
# hello_list[6:len(hello_list),1]
["w", "o", "r", "l", "d"]

>>> hello_list[: -3]
# hello_list[0: -3,1]
["r", "l", "d"]
```

0	1	2	3	4	5	6	7	8	9	10
h	e	l	l	o		w	o	r	l	d
-11	-10	-9	-8	-7	-6	-5	-4	-3	-2	-1

# THE TERRIFYING SLICING OPERATOR

\_ Examples of slicing [start:end:stride]. If the stride is a negative value and we don't specify the start of the end, these will be the end (len(list)) and the beginning of the list (0) respectively::

```
# Reverse a list making a copy
>>> hello_list[::-1]
# hello_list[len(hello_list):0,-1]
    ["d", "l", "r", "o", "w", " ", "o", "l", "l", "e", "h"]

# Reverse a list making a copy inplace
>>> hello_list.reverse()

>>> hello_list[:2:-2]
# hello_list[len(hello_list):2,1]
    ["d","r","w","o"]
```

# SLICING VS DEEPCOPY

\_ Copying a list can be easily achieved through the usage of the slice operation.

```
>>> src_list = [1, 2, 3, 4, 5, 6]
>>> copy_list = src_list[:]
>>> print(copy_list)
[1, 2, 3, 4, 5, 6]
>>> id(src_list)
4446869896
>>> id(copy_list)
4446829192
```

# SLICING VS DEEPCOPY

— But if the list contains another list, it will copy the reference not the list. Use deepcopy instead

```
>>> src_list = [[1, 2, 3], [4, 5, 6]]
>>> copy_list_ref = src_list[:]
>>> print(copy_list_ref)
[[1, 2, 3], [4, 5, 6]]
>>> src_list[0][0] = 1
>>> print(copy_list_ref)
[[0, 2, 3], [4, 5, 6]]

>>> import copy
>>> copy_list = copy.deepcopy(src_list)
```

4.3.

REMOVING  
FLAVOURS

# DANGEROUS OPERATIONS: REMOVE

\_ **Remove an element from a list:** removes the first matching element from a list. Slicing is called for removing the element.

```
function list_remove:
    input: list_object, value
    output: None if OK, NULL otherwise

    // Find the element to delete in the list
    for i in range(len(list_object):
        if comp(list_object[i], value) is True:

            // Slice the list to remove, recycle elements to delete
            // and resize the list
            if list_ass_slice(i, i+1):
                return None

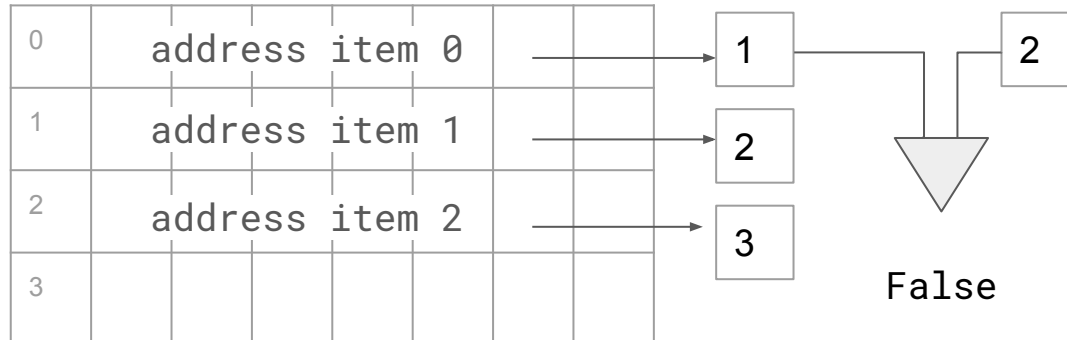
    //If the element is not in the list
    raise ValueError
    return NULL
```



# DANGEROUS OPERATIONS: REMOVE

\_ Removes an element from a list given its index

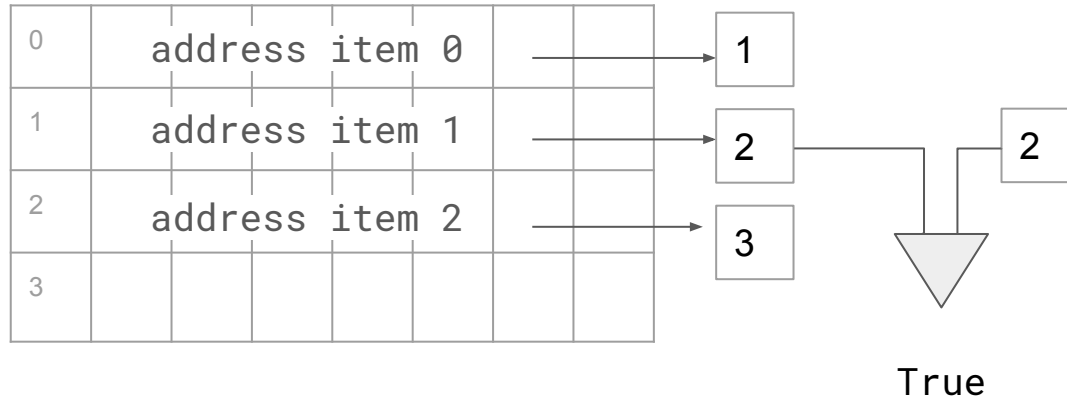
```
>>> rm_list = [1,2,3]  
>>> remove.rm_list(1)
```



# DANGEROUS OPERATIONS: REMOVE

\_ Removes an element from a list given its index

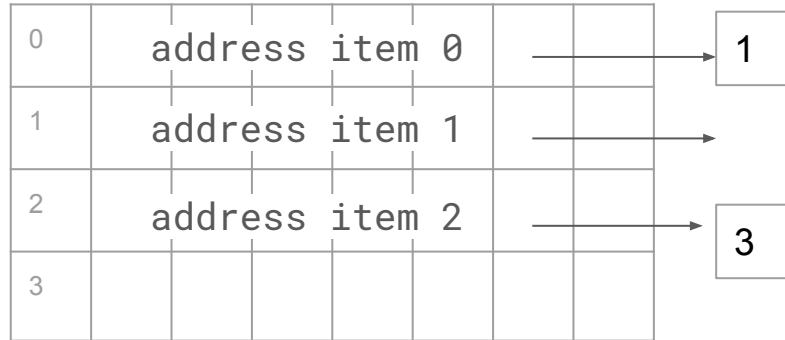
```
>>> rm_list = [1,2,3]  
>>> remove.rm_list(1)
```



# DANGEROUS OPERATIONS: REMOVE

\_ Removes an element from a list given its index

```
>>> rm_list = [1,2,3]
>>> remove.rm_list(1)
```



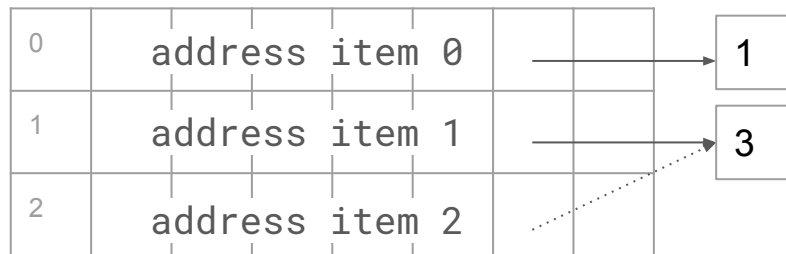
Recycling

2

# DANGEROUS OPERATIONS: REMOVE

\_ Removes an element from a list given its index

```
>>> rm_list = [1,2,3]
>>> remove.rm_list(1)
```



Recycling

2

# THE DELETING CERBERUS: DELETE, REMOVE, POP.

\_ There are differences between these operators but all of them are potentially dangerous, meaning  $O(n)$  .

\_ **Remove**: removes the first matching item.  $O(n)$

```
>>> rm_list = [1,2,3,2,4,2]
>>> remove.rm_list(2)
>>> print(rm_list)
      [1,3,2,4,2]
```

\_ **del**: removes item in the position of the index given.  $O(n)$

```
>>> del rm_list(3)
>>> print(rm_list)
      [1,2,3,4,2]
```

# THE DELETING CERBERUS: DELETE, REMOVE, POP.

\_ OK, I lied, only pop isn't as dangerous, but we are.

\_ **Pop**: removes item in a index and returns the element.

\_ Pop last:  $O(1)$

\_ Pop other:  $O(k)$

```
>>> rm_list = [1,2,3,2,4,5]
>>> rm_list.pop(3)
2
>>> print(rm_list)
[1,2,3,4,5]
>>> rm_list.pop()
5
```

# DANGEROUS USERS: POP

\_ **Pop an element from a list:** removes and returns the element at index (default last)

```
function list_pop_impl:
    input: list_object (self), index
    output: element at index if OK, NULL otherwise

    if len(list_object) == 0: return NULL
    if index > len(list_object) or index < 0: return NULL

    element = list_object[index]
    if index == len(list_object):
        return element if list_resize(self, len(list_object)-1)
        else return NULL
    else:
        // The list might be resized.
        return element if list_ass_slice(index, index+1)
        else None
```

5.

THE SORTED  
LIST



# SORT VS SORTED

— **Sorted** will create a new list where its elements will be sorted

```
>>> to_sort_list = [1,3,4,6,5,2]
>>> sorted_list = sorted(to_sort_list)
>>> print(sorted_list)
[1, 2, 3, 4, 5, 6]
```

— **Sort** will sort the list in place, saving memory because it doesn't need to create a new list and returns an iterable.

```
>>> to_sort = [1,4,3,2]
>>> to_sort.sort()
>>> print(to_sort)
[1, 2, 3, 4]
```

```
>>> to_sort = [1,4,3,2]
>>> to_sort.sort(reverse=True)
>>> print(to_sort)
[4, 3, 2, 1]
```

# THE SORTING ALGORITHM: TIMSORT

- \_ We have our very own sorting algorithm, because we have great developers in the community such as Tim Peters
- \_ Timsort is an hybrid algorithm, combining:
  - \_ Merge sort
  - \_ Insertion sort
- \_ In a nutshell, the algorithm marches over the array once finding “natural runs” —sorted chunks of the array— and merged intelligently.
- \_ If the array is less than 64 elements binary insertion sort is used.
- \_ **sort(\*, key=None, reverse=False):**
  - \_ Sorting will rely on the < operator of our data
  - \_ key specifies a function of one argument that is used to extract a comparison key from each list element

1.

BONUS TRACK:  
BEYOND THE  
BUILTIN LIST

# ARRAY

\_ Object type that exposes sequences of basic values: characters, integers, floating point numbers.

```
>>> from array import array
>>> a = array('l', [1, 2, 3])
>>> print(a)
array('i', [1, 2, 3])
```

# MEMVIEW

- \_ Exposes the C level buffer interface as a Python object.
- \_ Supports slicing as a subview.

```
>>> from array import array
>>> a = array('l', [1, 2, 3])
>>> print(a)
array('i', [1, 2, 3])
```

2.

BONUS TRACK:  
MORE COOL  
STUFF

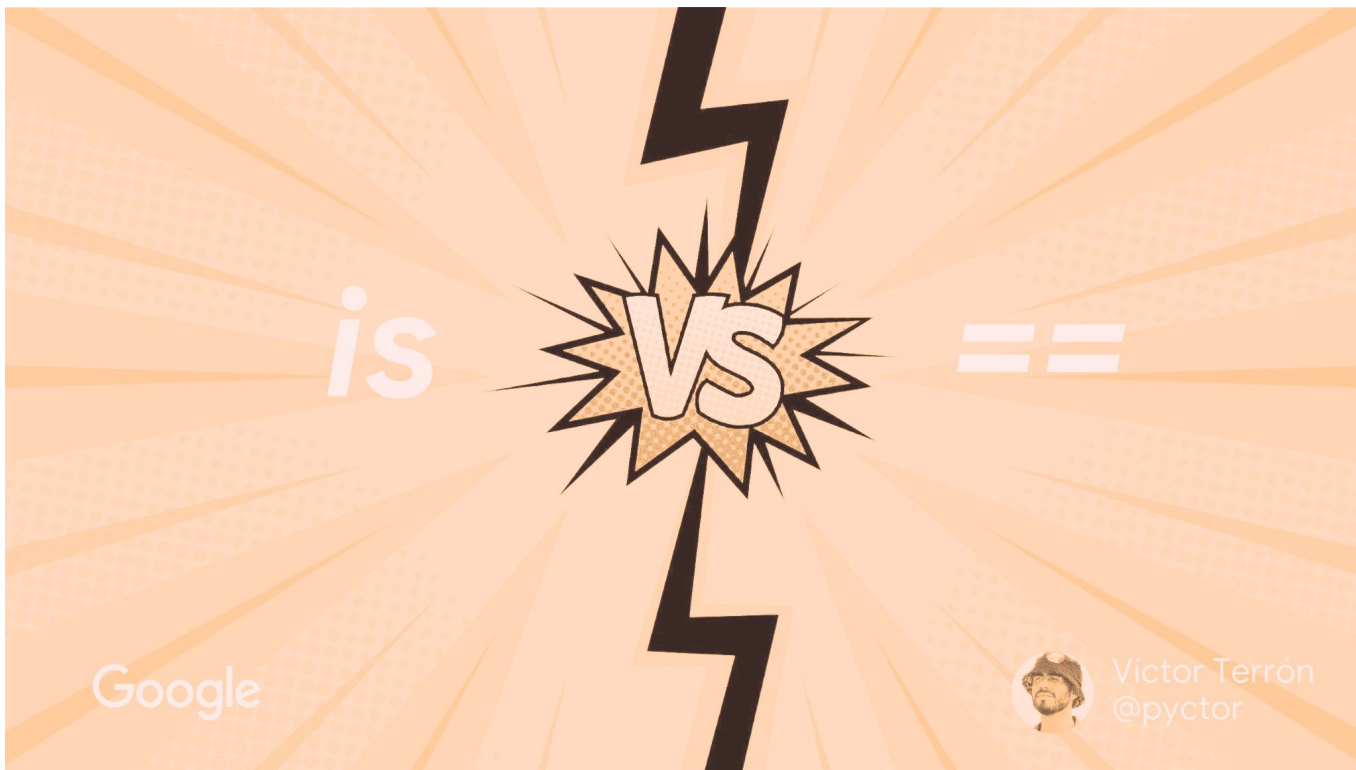
# APPEND OR +=

- \_ Same behaviour, dramatic differences

```
>>> list_add = []
>>> for i in range(5)
>>>     list_add.append(i)
>>> print(list_add)
[0, 1, 2, 3, 4]
```

```
>>> list_add = []
>>> for i in range(5)
>>>     list_add += [i]
>>> print(list_add)
[0, 1, 2, 3, 4]
```

# HOW TO COMPARE LISTS: == VS IS





The background of the slide is a solid, vibrant pink color. It features a complex, organic pattern of fine, wavy lines that create a sense of movement and depth, resembling a liquid or marbled texture. The lines are more pronounced in some areas, creating subtle gradients of pink.

THANKS