

Lists in Python are powerful and it is interesting to see how they are implemented internally.

Following is a simple Python script appending some integers to a list and printing them.

```
01 >>> l = []
02 >>> l.append(1)
03 >>> l.append(2)
04 >>> l.append(3)
05 >>> l
06 [1, 2, 3]
07 >>> for e in l:
08 ...     print e
09 ...
10 1
11 2
12 3
```

As you can see, lists are iterable.

List object C structure

A list object in CPython is represented by the following C structure. `ob_item` is a list of pointers to the list elements. `allocated` is the number of slots allocated in memory.

```
1 typedef struct {
2     PyObject_VAR_HEAD
3     PyObject**ob_item;
4     Py_ssize_t allocated;
5 } PyListObject;
```

List initialization

Let's look at what happens when we initialize an empty list. e.g. `l = []`.

```
1 arguments: size of the list = 0
2 returns: list object = []
3 PyListNew:
4     nbytes = size * size of global Python object = 0
5     allocate new list object
6     allocate list of pointers (ob_item) of size nbytes = 0
7     clear ob_item
8     set list's allocated var to 0 = 0 slots
9     return list object
```

It is important to notice the difference between allocated slots and the size of

the list. The size of a list is the same as `len(l)`. The number of allocated slots is what has been allocated in memory. Often, you will see that allocated can be greater than size. This is to avoid needing calling `realloc` each time a new elements is appended to the list. We will see more about that later.

Append

We append an integer to the list: `l.append(1)`. What happens? The internal C function `app1()` is called:

```

1 | arguments: list object, new element
2 | returns: 0 if OK, -1 if not
3 | app1:
4 |     n = size of list
5 |     call list_resize() to resize the list to size n+1 = 0 +
   | 1 = 1
6 |     list[n] = list[0] = new element
7 |     return 0

```

Let's look at `list_resize()`. It over-allocates memory to avoid calling `list_resize` too many time. The growth pattern of the list is: 0, 4, 8, 16, 25, 35, 46, 58, 72, 88, ...

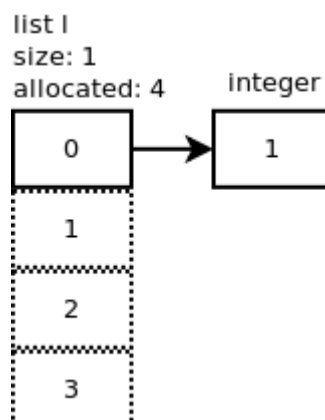
```

1 | arguments: list object, new size
2 | returns: 0 if OK, -1 if not
3 | list_resize:
4 |     new_allocated = (newsize >> 3) + (newsize < 9 ? 3 : 6)
   | = 3
5 |     new_allocated += newsize = 3 + 1 = 4
6 |     resize ob_item (list of pointers) to size new_allocated
7 |     return 0

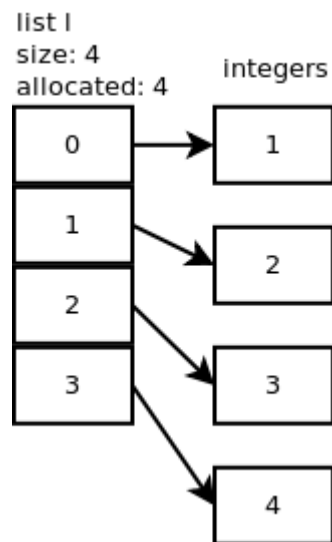
```

4 slots are now allocated to contain elements and the first one is the integer 1. You can see on the following diagram that `l[0]` points to the integer object that we just appended. The dashed squares represent the slots allocated but not used yet.

Append operation amortized complexity is $O(1)$.



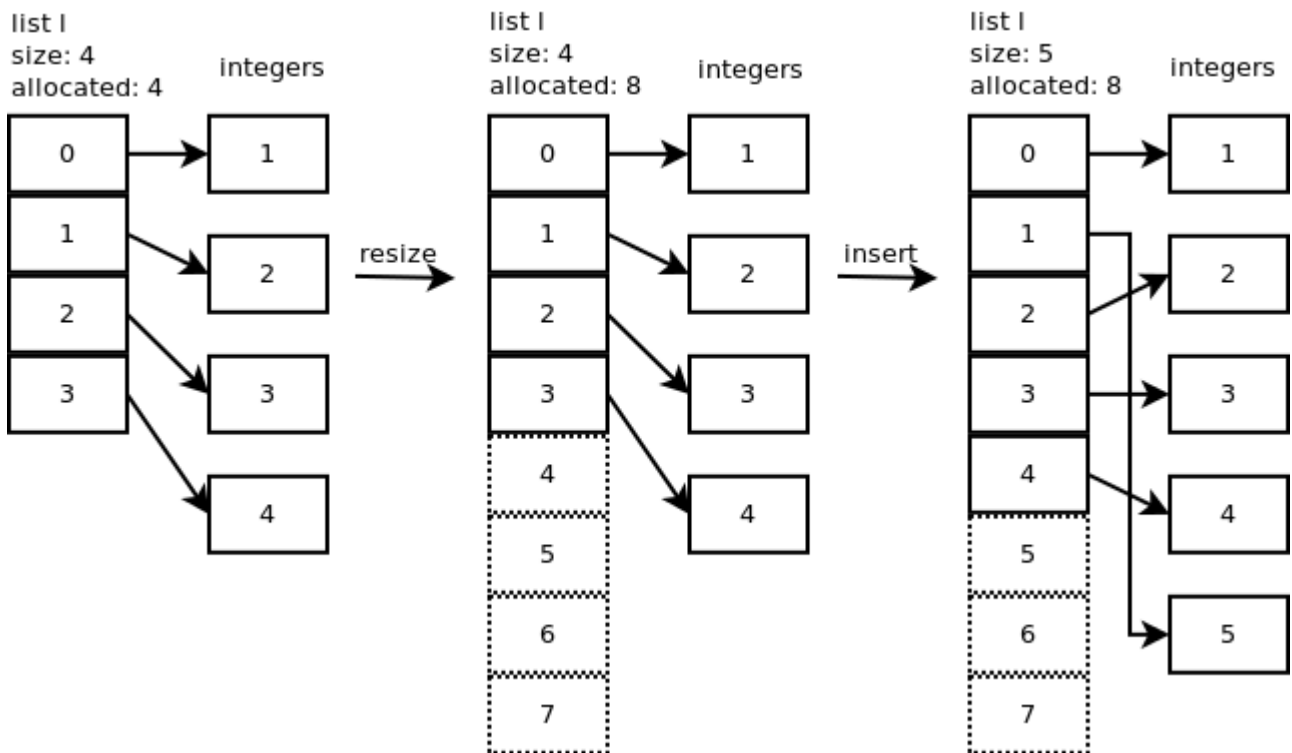
We continue by adding one more element: `l.append(2)`. `list_resize` is called with $n+1 = 2$ but because the allocated size is 4, there is no need to allocate more memory. Same thing happens when we add 2 more integers: `l.append(3)`, `l.append(4)`. The following diagram shows what we have so far.



Insert

Let's insert a new integer (5) at position 1: `l.insert(1,5)` and look at what happens internally. `ins1()` is called:

```
1 | arguments: list object, where, new element
2 | returns: 0 if OK, -1 if not
3 | ins1:
4 |     resize list to size  $n+1 = 5$  -> 4 more slots will be
   | allocated
5 |     starting at the last element up to the offset where,
   | right shift each element
6 |     set new element at offset where
7 |     return 0
```



The dashed squares represent the slots allocated but not used yet. Here, 8 slots are allocated but the size or length of the list is only 5.

Insert operation complexity is $O(n)$.

Pop

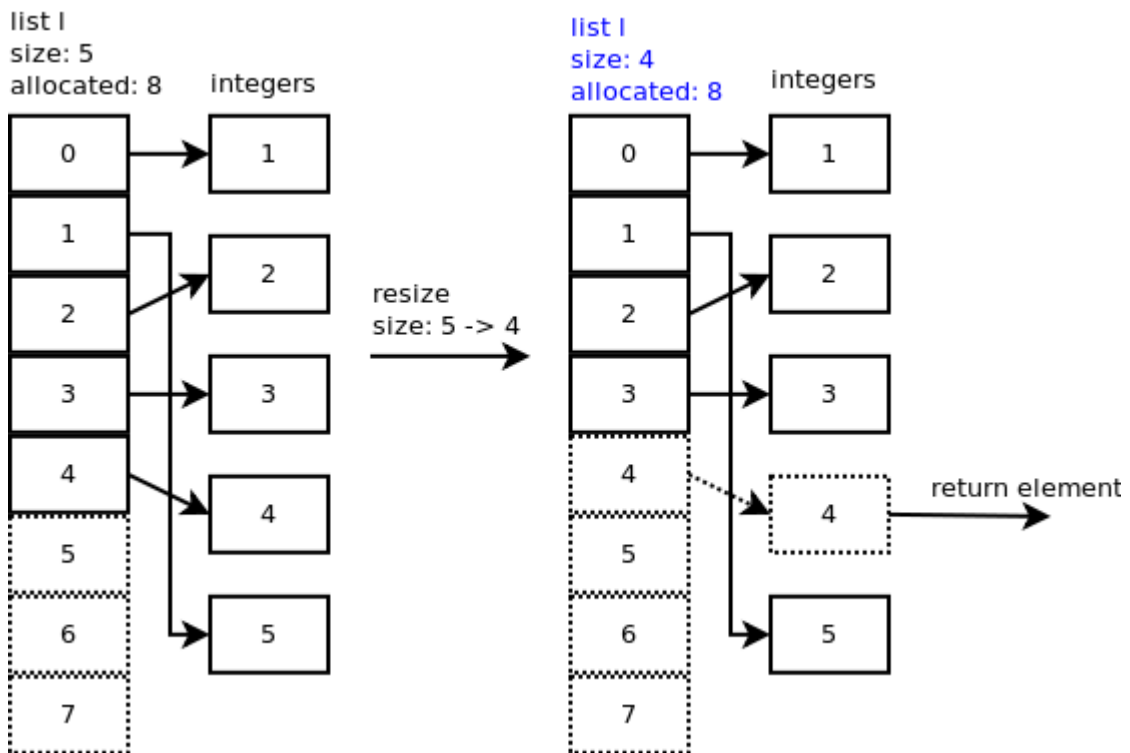
When you pop the last element: `l.pop()`, `listpop()` is called. `list_resize` is called inside `listpop()` and if the new size is less than half of the allocated size then the list is shrunk.

```

1 arguments: list object
2 returns: element popped
3 listpop:
4     if list empty:
5         return null
6     resize list with size 5 - 1 = 4. 4 is not less than 8/2
  so no shrinkage
7     set list object size to 4
8     return last element

```

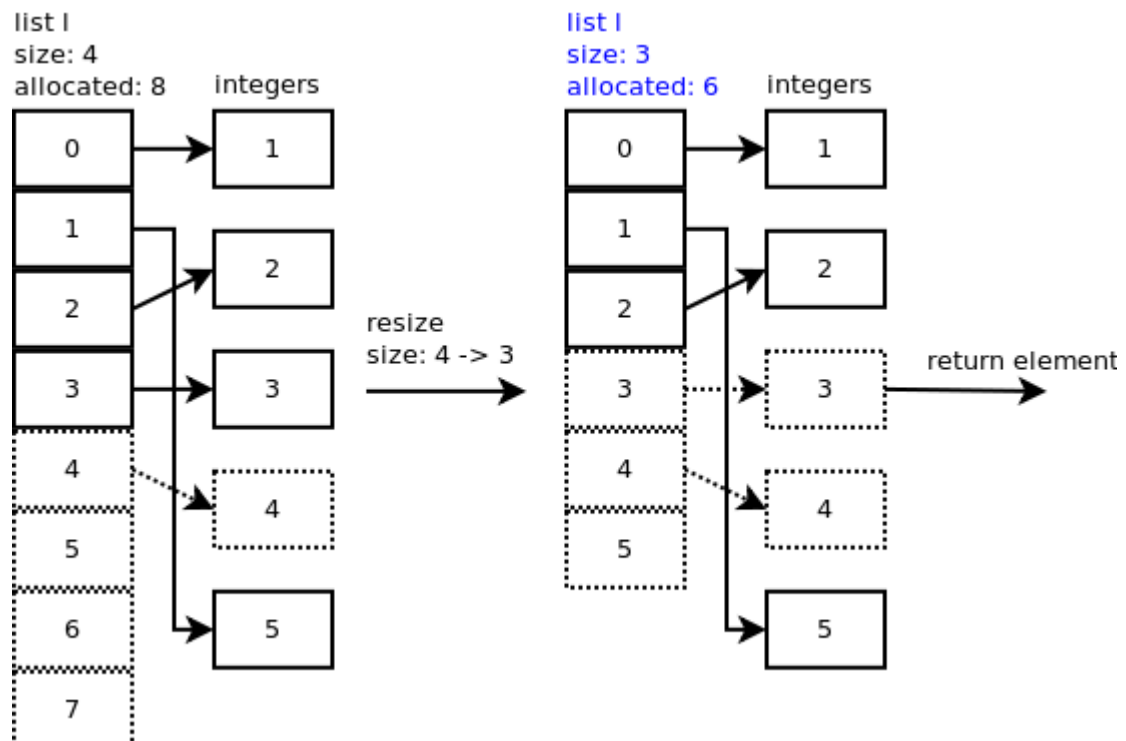
Pop operation complexity is $O(1)$.



You can observe that slot 4 still points to the integer but the important thing is the size of the list which is now 4.

Let's pop one more element. In `list_resize()`, $size - 1 = 4 - 1 = 3$ is less than half of the allocated slots so the list is shrunk to 6 slots and the new size of the list is now 3.

You can observe that slot 3 and 4 still point to some integers but the important thing is the size of the list which is now 3.



Remove

Python list object has a method to remove a specific element: `l.remove(5)`.
`listremove()` is called.

```
1 arguments: list object, element to remove
2 returns: none if OK, null if not
3 listremove:
4     loop through each list element:
5         if correct element:
6             slice list between element's slot and element's
slot + 1
7             return none
8     return null
```

To slice the list and remove the element, `list_ass_slice()` is called and it is interesting to see how it works. Here, low offset is 1 and high offset is 2 as we are removing the element 5 at position 1.

```
1 arguments: list object, low offset, high offset
2 returns: 0 if OK
3 list_ass_slice:
4     copy integer 5 to recycle list to dereference it
5     shift elements from slot 2 to slot 1
6     resize list to 5 slots
7     return 0
```

Remove operation complexity is $O(n)$.

