

Note: For formal explanations of the concepts on this discussion, feel free to look at the **Appendix** section on the back of the worksheet.

Linked Lists

A **linked list** is a recursive data structure that represents sequences. The `Link` class implements linked lists in Python. Each `Link` instance has a `first` attribute (which stores the first value of the linked list) and a `rest` attribute (which points to the rest of the linked list). An empty linked list is represented as `Link.empty`, and a non-empty linked list is represented as a `Link` instance.

Q1: WWPD: Linked Lists

What would Python display? Try drawing the box-and-pointer diagram if you get stuck!

```
>>> link = Link(1, Link(2, Link(3)))  
>>> link.first
```

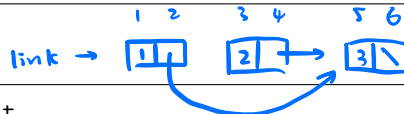
1

```
>>> link.rest.first
```

2

```
>>> link.rest.rest.rest is Link.empty
```

True



```
>>> link.rest = link.rest.rest  
>>> link.rest.first
```

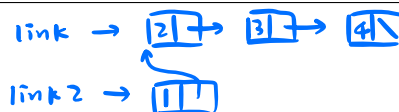
3

```
>>> link = Link(1)  
>>> link.rest = link  
>>> link.rest.rest.rest.rest.first
```



1

```
>>> link = Link(2, Link(3, Link(4)))  
>>> link2 = Link(1, link)  
>>> link2.rest.first
```



2

```
>>> link = Link(1000, 2000)
```

Error

2 *Linked Lists, Efficiency*

```
>>> link = Link(1000, Link())
```

Error



```
>>> link = Link(Link("Hello"), Link(2))
>>> link.first
```



```
Link("Hello")
>>> obj
>>> print(repr(obj))
```

```
>>> link = Link(Link("Hello"), Link(2))
>>> link.first.rest is Link.Empty
```

True

Q2: Sum Nums

Write a function `sum_nums` that receives a linked list `s` and returns the sum of its elements. You may assume the elements of `s` are all integers. Try to implement `sum_nums` with recursion!

```
def sum_nums(s):
    """
    Returns the sum of the elements in s.

    >>> a = Link(1, Link(6, Link(7)))
    >>> sum_nums(a)
    14
    """
    """ YOUR CODE HERE """
    if s is Link.empty:
        return 0
    return s.first + sum_nums(s.rest)

# You can use more space on the back if you want
```

```
sum = 0
while s is not Link.empty:
    sum += s.first
    s = s.rest
return sum
```

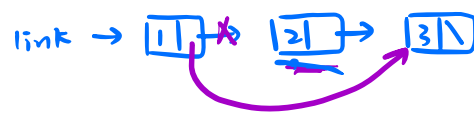
Q3: Remove All

Write a function `remove_all` that takes a linked list and a value as input. This function mutates the linked list by removing all nodes that store value.

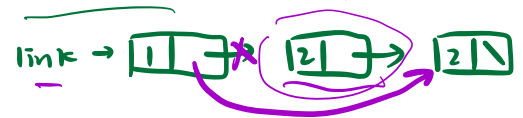
You may assume the first element of the linked list is not equal to value. You should mutate the input linked list; `remove_all` does not return anything.

```
def remove_all(link, value):
    """Removes all nodes in link that contain value. The first element of
    link is never equal to value.

    >>> l1 = Link(0, Link(2, Link(2, Link(3, Link(1, Link(2, Link(3))))))
    >>> print(l1)
    <0 2 2 3 1 2 3>
    >>> remove_all(l1, 2)
    >>> print(l1)
    <0 3 1 3>
    >>> remove_all(l1, 3)
    >>> print(l1)
    <0 1>
    >>> remove_all(l1, 3)
    >>> print(l1)
    <0 1>
    """
```



```
link.rest = link.rest.rest
remove_all(link, 2)
```



```
if link is Link.empty or
    link.rest is Link.empty:
    return
if link.rest.first == value:
    link.rest = link.rest.rest
    remove_all(link, value)
else:
    remove_all(link.rest, value)
```

```
while link is not Link.empty or
    link.rest is not Link.empty:
    if link.rest.rest == value:
        link.rest = link.rest.rest
    else:
        link = link.rest
return
```

You can use more space on the back if you want

Q4: Flip Two

Write a recursive function `flip_two` that receives a linked list `s` and flips every pair of values in `s`.

```
def flip_two(s):
    """
    Flips every pair of values in s.

    >>> one_lnk = Link(1)
    >>> flip_two(one_lnk)
    >>> one_lnk
    Link(1)
    >>> lnk = Link(1, Link(2, Link(3, Link(4, Link(5))))))
    >>> flip_two(lnk)
    >>> lnk
    Link(2, Link(1, Link(4, Link(3, Link(5))))))
    """
    """*** YOUR CODE HERE ***"""

*** YOUR CODE HERE ***
```

Q5: Make Circular

Write a function `make_circular` that takes in a non-circular, non-empty linked list `s` and mutates `s` so that it becomes circular.

```
def make_circular(s):  
    """Mutates linked list s into a circular linked list.  
  
    >>> lnk = Link(1, Link(2, Link(3)))  
    >>> make_circular(lnk)  
    >>> lnk.rest.first  
    2  
    >>> lnk.rest.rest.first  
    3  
    >>> lnk.rest.rest.rest.first  
    1  
    >>> lnk.rest.rest.rest.rest.first  
    2  
    """  
    "*** YOUR CODE HERE ***"
```

```
# You can use more space on the back if you want
```

Efficiency

A function's runtime complexity is a measure of how the runtime of the function changes as its input changes. A function $f(n)$ has...

- constant runtime if the runtime of f does not depend on n . Its runtime is $\Theta(1)$.
- logarithmic runtime if the runtime of f is proportional to $\log(n)$. Its runtime is $\Theta(\log(n))$.
- linear runtime if the runtime of f is proportional to n . Its runtime is $\Theta(n)$.
- quadratic runtime if the runtime of f is proportional to n^2 . Its runtime is $\Theta(n^2)$.
- exponential runtime if the runtime of f is proportional to b^n , for some constant b . Its runtime is $\Theta(b^n)$.

Q6: WWPD: Orders of Growth

What is the *worst-case* runtime of `is_prime`?

```
def is_prime(n):
    for i in range(2, n):
        if n % i == 0:
            return False
    return True
```

Choose one of:

- Constant
- Logarithmic
- Linear
- Quadratic
- Exponential
- None of these

What is the order of growth of the runtime of `bar(n)` with respect to `n`?

```
def bar(n):
    i, sum = 1, 0
    while i <= n:
        sum += biz(n)
        i += 1
    return sum

def biz(n):
    i, sum = 1, 0
    while i <= n:
        sum += i**3
        i += 1
    return sum
```

Choose one of:

- Constant
- Logarithmic
- Linear
- Quadratic
- Exponential
- None of these

What is the order of growth of the runtime of `foo` in terms of `n`, where `n` is the length of `lst`? Assume that slicing a list and evaluating `len(lst)` take constant time.

Express your answer with Θ notation.

```
def foo(lst, i):
    mid = len(lst) // 2
    if mid == 0:
        return lst
    elif i > 0:
        return foo(lst[mid:], -1)
    else:
        return foo(lst[:mid], 1)
```


Appendix: Explanation of Material

Linked Lists

The `Link` class implements linked lists in Python. Each `Link` instance has a `first` attribute (which stores the first value of the linked list) and a `rest` attribute (which points to the rest of the linked list).

```
class Link:
    empty = ()

    def __init__(self, first, rest=empty):
        assert rest is Link.empty or isinstance(rest, Link)
        self.first = first
        self.rest = rest

    def __repr__(self):
        if self.rest is not Link.empty:
            rest_repr = ', ' + repr(self.rest)
        else:
            rest_repr = ''
        return 'Link(' + repr(self.first) + rest_repr + ')'

    def __str__(self):
        string = '<'
        while self.rest is not Link.empty:
            string += str(self.first) + ' '
            self = self.rest
        return string + str(self.first) + '>'
```

An empty linked list is represented as `Link.empty`, and a non-empty linked list is represented as a `Link` instance.

The `rest` attribute of a `Link` instance is always another linked list! When `Link` instances are linked via their `rest` attributes, a sequence is formed.

To check if a linked list is empty, compare it to the class attribute `Link.empty`.

Efficiency

Throughout this class, we have mainly focused on *correctness* — whether a program produces the correct output. However, computer scientists are also interested in creating *efficient* solutions to problems. One way to quantify efficiency is to determine how a function’s *runtime* changes as its input changes. In this class, we measure a function’s runtime by the number of operations it performs.

A function $f(n)$ has...

- constant runtime if the runtime of f does not depend on n . Its runtime is $\Theta(1)$.
- logarithmic runtime if the runtime of f is proportional to $\log(n)$. Its runtime is $\Theta(\log(n))$.
- linear runtime if the runtime of f is proportional to n . Its runtime is $\Theta(n)$.
- quadratic runtime if the runtime of f is proportional to n^2 . Its runtime is $\Theta(n^2)$.
- exponential runtime if the runtime of f is proportional to b^n , for some constant b . Its runtime is $\Theta(b^n)$.

Example 1: It takes a single multiplication operation to compute `square(1)`, and it takes a single multiplication operation to compute `square(100)`. In general, calling `square(n)` results in a *constant* number of operations that does not vary according to n . We say `square` has a runtime complexity of $\Theta(1)$.

input	function call	return value	operations
1	<code>square(1)</code>	<code>1*1</code>	1
2	<code>square(2)</code>	<code>2*2</code>	1
...
100	<code>square(100)</code>	<code>100*100</code>	1
...
n	<code>square(n)</code>	<code>n*n</code>	1

Example 2: It takes a single multiplication operation to compute `factorial(1)`, and it takes 100 multiplication operations to compute `factorial(100)`. As n increases, the runtime of `factorial` increases *linearly*. We say `factorial` has a runtime complexity of $\Theta(n)$.

input	function call	return value	operations
1	<code>factorial(1)</code>	<code>1*1</code>	1
2	<code>factorial(2)</code>	<code>2*1*1</code>	2
...
100	<code>factorial(100)</code>	<code>100*99*...*1*1</code>	100
...
n	<code>factorial(n)</code>	<code>n*(n-1)*...*1*1</code>	n

Example 3: Consider the following function:

```
def bar(n):
    for a in range(n):
        for b in range(n):
            print(a,b)
```

Evaluating `bar(1)` results in a single `print` call, while evaluating `bar(100)` results in 10,000 `print` calls. As n

increases, the runtime of `bar` increases *quadratically*. We say `bar` has a runtime complexity of $\Theta(n^2)$.

input	function call	operations (prints)
1	<code>bar(1)</code>	1
2	<code>bar(2)</code>	4
...
100	<code>bar(100)</code>	10000
...
n	<code>bar(n)</code>	n^2

Example 4: Consider the following function:

```
def rec(n):
    if n == 0:
        return 1
    else:
        return rec(n - 1) + rec(n - 1)
```

Evaluating `rec(1)` results in a single addition operation. Evaluating `rec(4)` results in $2^4 - 1 = 15$ addition operations, as shown by the diagram below.

During the evaluation of `rec(4)`, there are two calls to `rec(3)`, four calls to `rec(2)`, eight calls to `rec(1)`, and 16 calls to `rec(0)`.

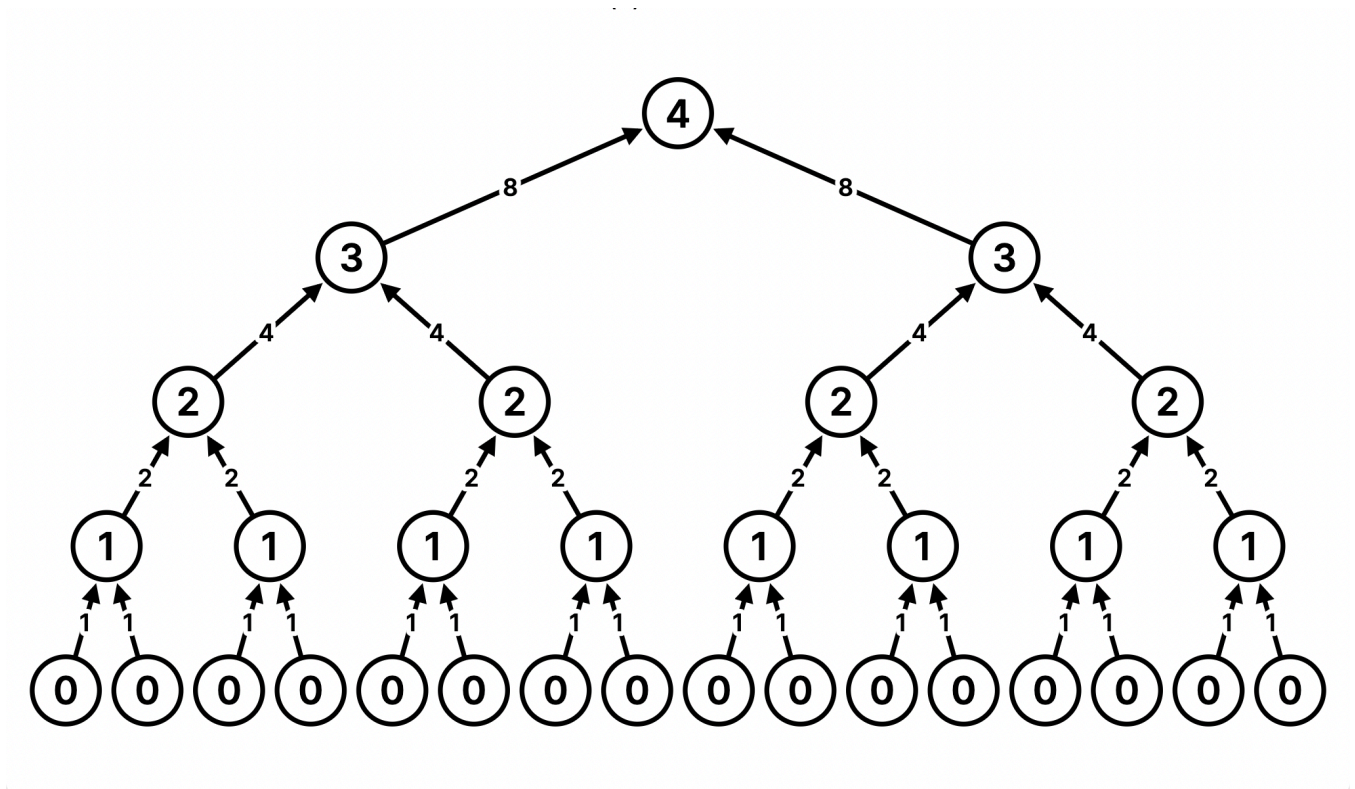
So we have eight instances of `rec(0) + rec(0)`, four instances of `rec(1) + rec(1)`, two instances of `rec(2) + rec(2)`, and a single instance of `rec(3) + rec(3)`, for a total of $1 + 2 + 4 + 8 = 15$ addition operations.

As `n` increases, the runtime of `rec` increases *exponentially*. In particular, the runtime of `rec` approximately doubles when we increase `n` by 1. We say `rec` has a runtime complexity of $\Theta(2^n)$.

input	function call	return value	operations
1	<code>rec(1)</code>	2	1
2	<code>rec(2)</code>	4	3
...
10	<code>rec(10)</code>	1024	1023
...
n	<code>rec(n)</code>	2^n	$2^n - 1$

Tips for finding the order of growth of a function's runtime:

- If the function is recursive, determine the number of recursive calls and the runtime of each recursive call.
- If the function is iterative, determine the number of inner loops and the runtime of each loop.
- Ignore coefficients. A function that performs `n` operations and a function that performs `100 * n` operations are both linear.
- Choose the largest order of growth. If the first part of a function has a linear runtime and the second part has a quadratic runtime, the overall function has a quadratic runtime.
- In this course, we only consider constant, logarithmic, linear, quadratic, and exponential runtimes.



Above: Call structure of `rec(4)`.