

Efficiency

Announcements

Tree Class

Tree Class

A Tree has a label and a list of branches; each branch is a Tree

```
class Tree:  
    def __init__(self, label, branches=[]):  
        self.label = label  
        for branch in branches:  
            assert isinstance(branch, Tree)  
        self.branches = list(branches)  
  
def fib_tree(n):  
    if n == 0 or n == 1:  
        return Tree(n)  
    else:  
        left = fib_tree(n-2)  
        right = fib_tree(n-1)  
        fib_n = left.label + right.label  
    return Tree(fib_n, [left, right])
```

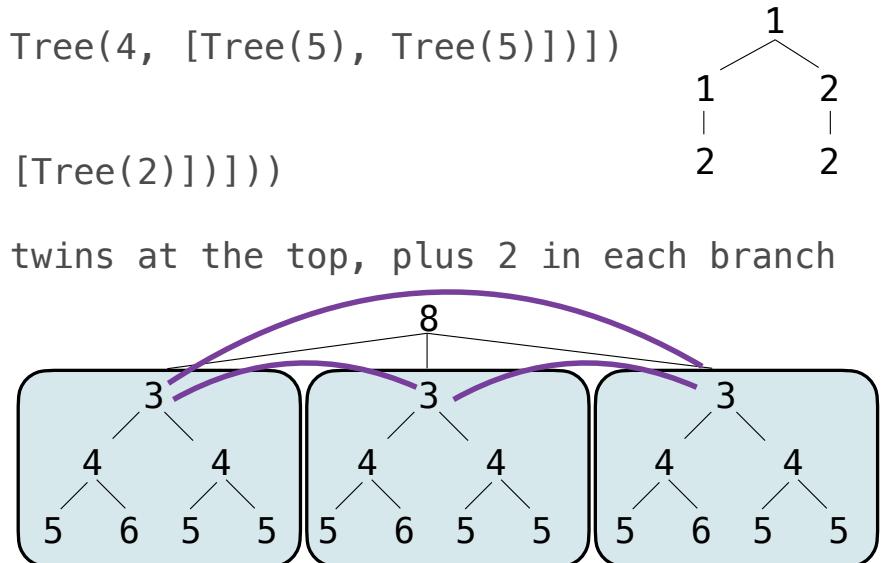
Tree class	tree data abstraction
<pre>class Tree: def __init__(self, label, branches=[]): self.label = label for branch in branches: assert isinstance(branch, Tree) self.branches = list(branches) def fib_tree(n): if n == 0 or n == 1: return Tree(n) else: left = fib_tree(n-2) right = fib_tree(n-1) fib_n = left.label + right.label return Tree(fib_n, [left, right])</pre>	<pre>def tree(label, branches=[]): for branch in branches: assert is_tree(branch) return [label] + list(branches) def label(tree): return tree[0] def branches(tree): return tree[1:] def fib_tree(n): if n == 0 or n == 1: return tree(n) else: left = fib_tree(n-2) right = fib_tree(n-1) fib_n = label(left) + label(right) return tree(fib_n, [left, right])</pre>

Example: Count Twins

Implement `twins`, which takes a Tree `t`. It return the number of pairs of sibling nodes whose labels are equal. **Definition:** Two nodes are siblings if they have the same parent.

```
def twins(t):
    """Count the pairs of sibling nodes with equal labels.

>>> t1 = Tree(3, [Tree(4, [Tree(5), Tree(6)]), Tree(4, [Tree(5), Tree(5)])])
>>> twins(t1) # 4 and 5
2
>>> twins(Tree(1, [Tree(1, [Tree(2)]), Tree(2, [Tree(2)])]))
0
>>> twins(Tree(8, [t1, t1, t1])) # 3 pairs of twins at the top, plus 2 in each branch
9
"""
count = 0
n = len(t.branches)
for i in range(n-1):
    for j in range(i+1, n):
        if t.branches[i].label == t.branches[j].label:
            count += 1
return count + sum([twins(b) for b in t.branches])
```



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Linked List Example: Cycles

Create a List and Linked List

```
def cycle(k, n):
    """Build an n-element list that cycles among range(k).

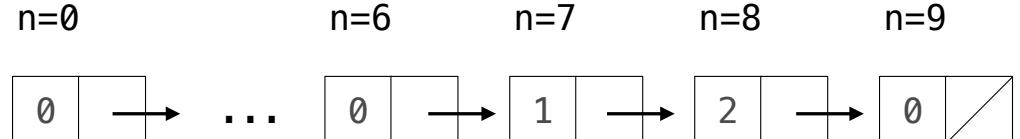
>>> cycle(3, 10)
[0, 1, 2, 0, 1, 2, 0, 1, 2, 0]
"""

s = []
for i in range(n):
    s.append(i % k) # Add to the end
return s
```

```
class Link:
    empty = ()
    def __init__(self, first, rest=empty):
        assert ... # rest is a linked list
        self.first = first
        self.rest = rest
```

```
def cycle_link(k, n):
    """Build an n-element linked list that cycles among range(k).
```

```
>>> print(cycle_link(3, 10))
(0 1 2 0 1 2 0 1 2 0)
.....
s = Link.empty
while n > 0:
    n -= 1
    s = Link(n % k, s) # Add to the front
return s
```



Create a Linked List by Appending

```
def cycle(k, n):
    """Build an n-element list that cycles among range(k).

>>> cycle(3, 10)
[0, 1, 2, 0, 1, 2, 0, 1, 2, 0]
"""

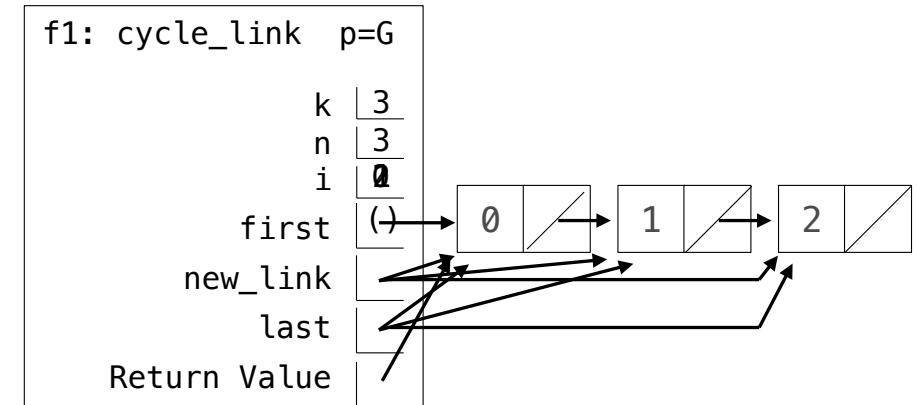
s = []
for i in range(n):
    s.append(i % k) # Add to the end
return s

def cycle_link(k, n):
    """Build an n-element linked list that cycles among range(k).

>>> print(cycle_link(3, 10))
(0 1 2 0 1 2 0 1 2 0)
"""

first = Link.empty
for i in range(n):
    new_link = Link(i % k)
    if first is Link.empty:
        first, last = new_link, new_link
    else:
        last.rest = new_link # Add to the end
        last = new_link
return first
```

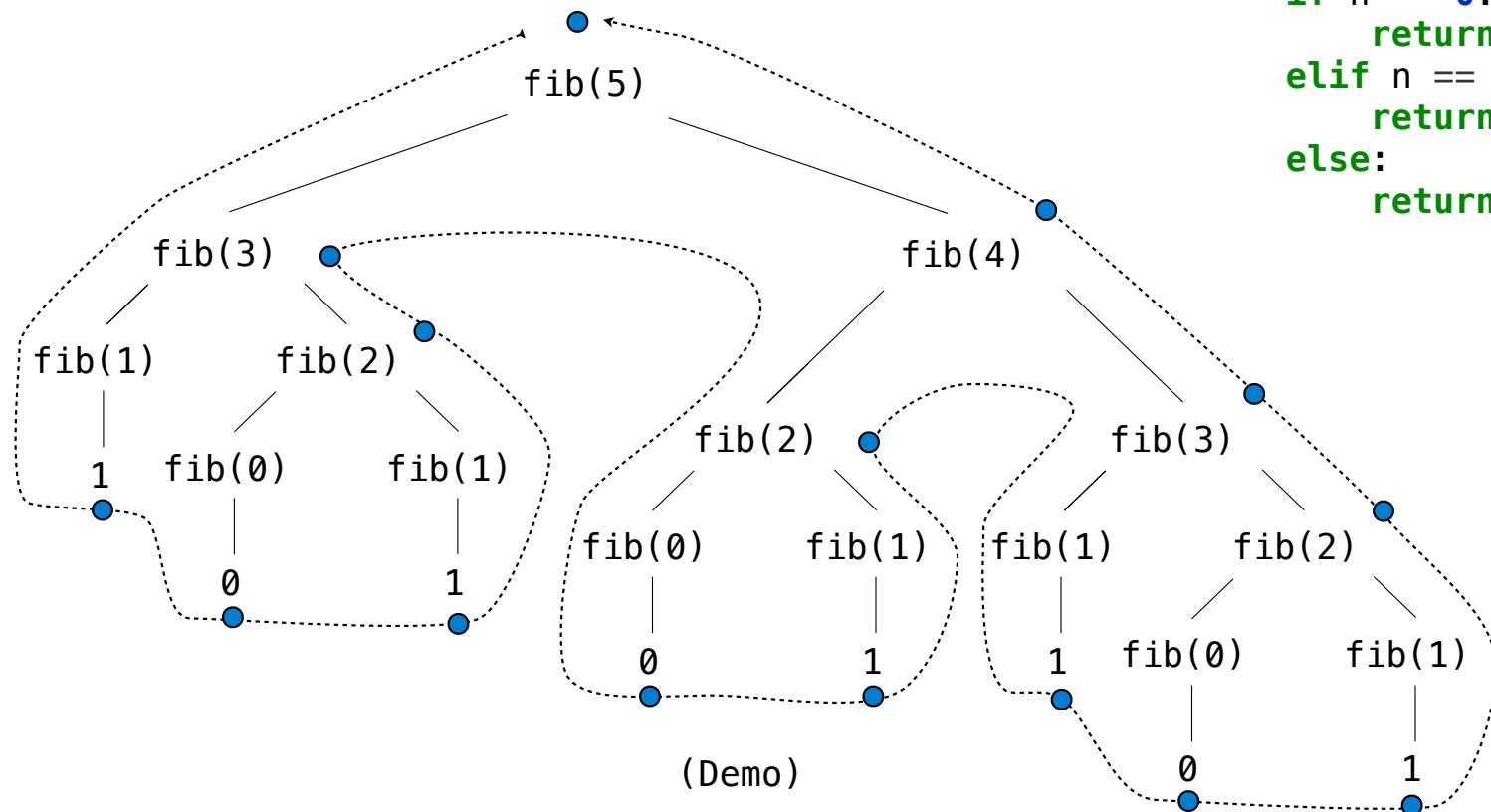
```
class Link:
    empty = ()
    def __init__(self, first, rest=empty):
        assert ... # rest is a linked list
        self.first = first
        self.rest = rest
```



Measuring Efficiency

Recursive Computation of the Fibonacci Sequence

Our first example of tree recursion:



```
def fib(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fib(n-2) + fib(n-1)
```

Memoization

Memoization

Idea: Remember the results that have been computed before

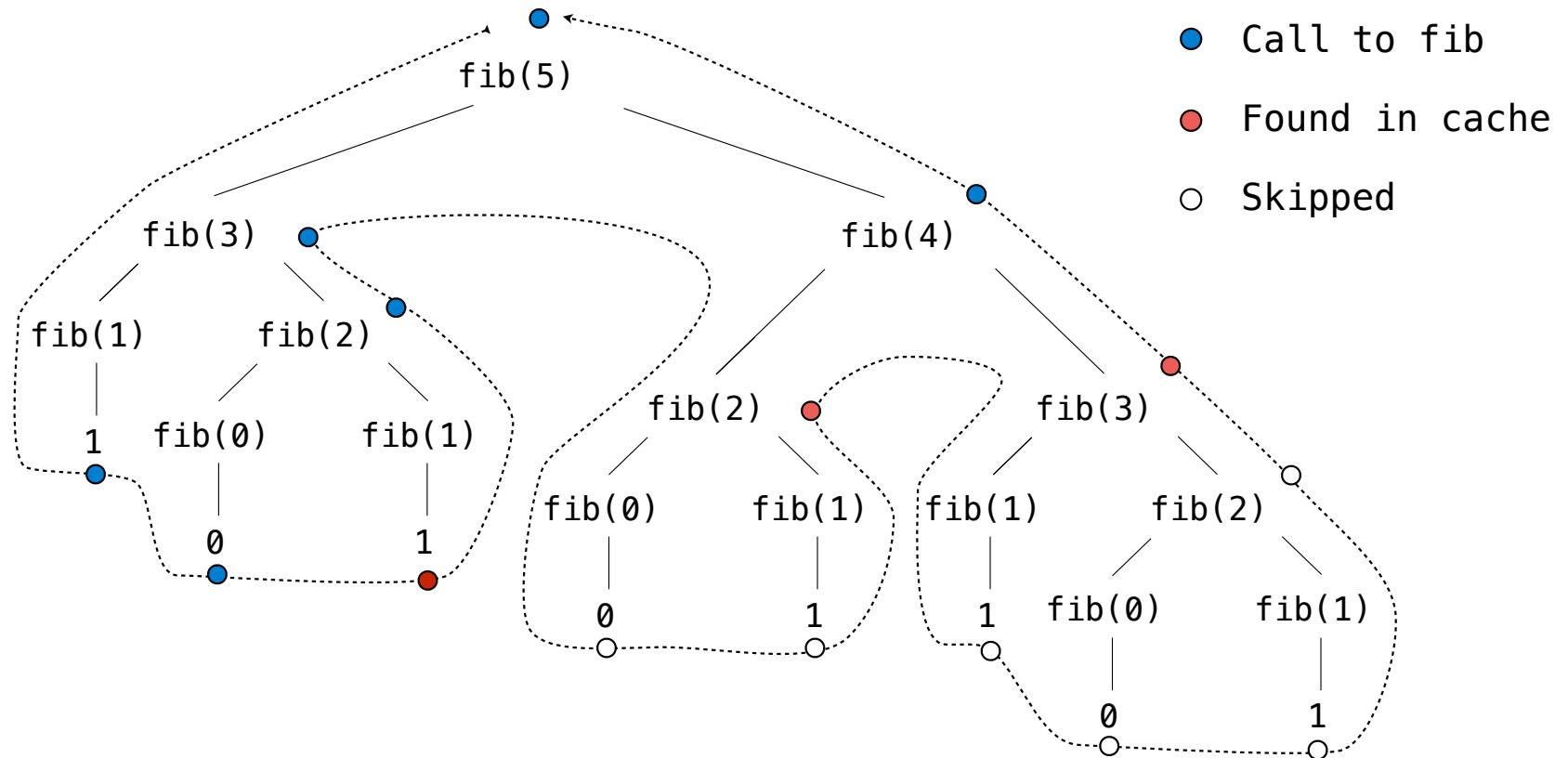
```
def memo(f):
    cache = {}
    def memoized(n):
        if n not in cache:
            cache[n] = f(n)
        return cache[n]
    return memoized
```

Keys are arguments that map to return values

Same behavior as f, if f is a pure function

(Demo)

Memoized Tree Recursion



Orders of Growth

Common Orders of Growth

Common examples:

Exponential growth. E.g., recursive `fib`

Incrementing n multiplies *time* by a constant

Tree recursion
(without memoization)

Quadratic growth.

Incrementing n increases *time* by n times a constant

Two nested loops:
For each element in a list,
process a whole list

Linear growth.

Incrementing n increases *time* by a constant

For each element in a list,
do a fixed amount of work

Logarithmic growth.

Doubling n only increments *time* by a constant

Each step shrinks the problem
by half (or some fraction)

Constant growth. Increasing n doesn't affect time

Just process the first few
elements of a list

Repeated Inserts (Revisited)

Double a List and a Linked List (Last Lecture)

```
double(    cycle(      5, 100000), 3): 302ms
double_link(cycle_link(5, 100000), 3): 15ms
```

```
def double(s, v):
    """Insert another v after each v.

>>> s = [2, 7, 1, 8, 2, 8]
>>> double(s, 8)
>>> s
[2, 7, 1, 8, 8, 2, 8, 8]
"""

i = 0
while i < len(s):
    if s[i] == v:
        s.insert(i+1, v)
        i += 2
    else:
        i += 1
```

Quadratic Growth

Shift over
everything
after i+1

```
def double_link(s, v):
    """Insert another v after each v.

>>> end = Link(1, Link(8, Link(2, Link(8))))
>>> t = Link(2, Link(7,end))
>>> double_link(t, 8)
>>> print(t)
(2 7 1 8 8 2 8 8)
"""

while s is not Link.empty :
    if s.first == v:
        s.rest = Link(v, s.rest)
        s = s.rest.rest
    else:
        s = s.rest
```

Linear Growth

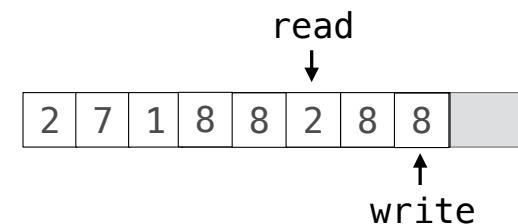
Make
1 Link

Double a List with Linear Growth

Could you insert another v after each v in a Python list s with linear growth?

```
def double_fast(s, v):
    """Insert another v after each v in s.

>>> s = [2, 7, 1, 8, 2, 8]
>>> double_fast(s, 8)
>>> s
[2, 7, 1, 8, 8, 2, 8, 8]
"""
read = len(s) - 1
vs = s.count(v)
s.extend([0 for _ in range(vs)]) # Make space
write = len(s) - 1
while write > read:
    if s[read] == v:
        s[write] = v
        s[write - 1] = v
        write -= 2
    else:
        s[write] = s[read]
        write -= 1
    read -= 1
```



```
double(    cycle(      5, 100000), 3): 302ms
double_link(cycle_link(5, 100000), 3): 15ms
double_fast(cycle(      5, 100000), 3): 8ms
```

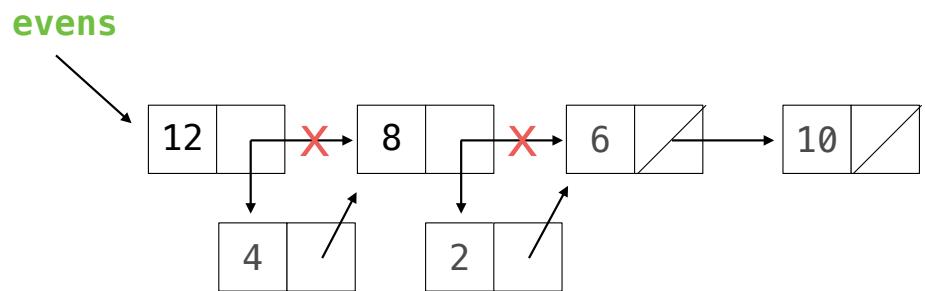
Linked List Practice

Inserting into a Linked List

```
def insert_link(s, x, i):
    """Insert x into linked list s at index i.

>>> evens = Link(4, Link(2, Link(6)))
>>> insert_link(evens, 8, 1)
>>> insert_link(evens, 10, 4)
>>> insert_link(evens, 12, 0)
>>> insert_link(evens, 14, 10)
Index out of range
>>> print(evens)
(12 4 8 2 6 10)
"""

if s is Link.empty:
    print('Index out of range')
elif i == 0:
    second = Link(s.first, s.rest)
    s.first = _____x_____
    s.rest = second
elif i == 1 and s.rest is Link.empty:
    s.rest = Link(x)
else:
    insert_link(s.rest, x, i-1)
```

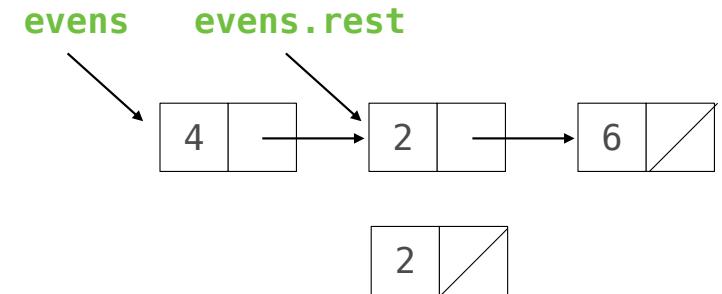


Slicing a Linked List

Normal slice notation (such as `s[1:3]`) doesn't work if `s` is a linked list.

```
def slice_link(s, i, j):
    """Return a linked list containing elements from i:j.

>>> evens = Link(4, Link(2, Link(6)))
>>> slice_link(evens, 1, 100)
Link(2, Link(6))
>>> slice_link(evens, 1, 2)
Link(2)
>>> slice_link(evens, 0, 2)
Link(4, Link(2))
>>> slice_link(evens, 1, 1) is Link.empty
True
"""
assert i >= 0 and j >= 0
if j == 0 or s is Link.empty:
    return Link.empty
elif i == 0:
    return Link(s.first, slice_link(s.rest, i, j-1))
else:
    return slice_link(s.rest, i-1, j-1)
```



`slice_link(evens, 1, 2)` returns
`slice_link(evens.rest, 0, 1)` links 2 to
`slice_link(evens.rest.rest, 0, 0)` returns `Link.empty`

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