

# Lecture 29: Streams and Lazy Evaluation

Some of the most interesting real-world problems in computer science center around sequential data.

- DNA sequences.
- Web and cell-phone traffic streams.
- The social data stream.
- Series of measurements from instruments on a robot.
- Stock prices, weather patterns.

# Finite to Infinite

Currently, all our sequence data structures share common limitations:

- Each item must be explicitly represented, even if all can be generated by a common formula or function
- Sequence must be complete before we start iterating over it.
- Can't be infinite. Who cares?
  - "Infinite" in practical terms means "having an unknown bound".
  - Such things are everywhere.
  - Internet and cell phone traffic.
  - Instrument measurement feeds, real-time data.
  - Mathematical sequences.

# Review: Iterables

- The Python `for` loop

```
for x in L:  
    BODY
```

can use one of two strategies:

Iterator

```
_ITER = L.__iter__()  
while True:  
    try:  
        x = _ITER.__next__()  
        BODY  
    except StopIteration:  
        break
```

Counter

```
_I, _L = 0, L  
while True:  
    try:  
        x = _L[_I]  
        BODY  
        _I += 1  
    except IndexError:  
        break
```

- Crucial point: Iterators don't compute items in a sequence until they are asked to. They are *lazy* (a technical term!).

# Iterables and Iterators

- Lists, dictionaries, and tuples are iterables; The `__iter__` method on them yields an iterator.
- On standard iterators, the `__iter__` method yields itself:

```
>>> L = [1, 2, 3]
>>> it = L.__iter__()
>>> it is it.__iter__()
True
```

- This is useful, because several standard procedures (`map`, `zip`, `re.finditer`) return iterators, and several functions (like `sum`) use them:

```
>>> L, P = [1, -2, 3], [2, 0, 4]
>>> map(abs, L)
<map object at 0x7f5f260dc2b0>
>>> sum(map(abs, L))
6
>>> map(abs, L)[0]
ERROR (an iterator, not an iterable)
```

# Generators: Another Kind of Iterator

- Generators provide a concise and elegant way to write iterators.
- Example: generator returning lists [0], [0, 1], [0, 1, 2], ...

```
def triangle(n):  
    """Generates all lists of the form [0], [0,1], ...,  
    up to [0,...n-1]."""  
    L = []  
    for i in range(0, n):  
        L += [i]  
        yield L
```

```
>>> for p in triangle(3):  
...     print(p)  
[0]  
[0, 1]  
[0, 1, 2]
```

# Generators, explained

- A generator function is one that contains a **yield** statement.
- When called, a generator function returns a generator object.
- The generator object defines `__next__`, and acts like an iterator.
- When called, this `__next__` function executes the body of the generator up to the next call to **yield** and then returns the result.
- On each subsequent call, starts from after the **yield** statement.
- Stops iterating on exit from the generator function.

# Example With Trees

- Suppose we want to generate the labels of a tree in post-order (i.e., labels of children first, then label of node):

```
def tree_labels(t):  
    for c in t.children:  
        for lab in tree_labels(c):  
            yield lab  
    yield t.label
```

- More succinctly, can write this as

```
def tree_labels(t):  
    for c in t.children:  
        yield from tree_labels(c)  
    yield t.label
```

- Now we can print all labels in a tree with

```
for lab in tree_labels(t): print(lab)
```

# Streams: Another Lazy Structure

We'll define a *Stream* to look like an rlist whose `rest` is computed lazily.

```
class Stream(object):
    """A lazily computed recursive list."""
    empty = ... # Some object representing an empty stream

    def __init__(self, first, compute_rest=lambda: Stream.empty):
        self.first, self._compute_rest = first, compute_rest

    @property
    def rest(self):
        """Return the rest of the stream, computing it once."""
        if self._compute_rest is not None:
            self._rest = self._compute_rest()
            self._compute_rest = None
        return self._rest

    def __repr__(self):
        return 'Stream({0}, <...>'.format(repr(self.first))
```



# Basic Stream Operations

```
>>> s1 = Stream(1, lambda: Stream(2))
>>> s1.first
1
>>> s1.rest.first
2
>>> s1.rest.rest
Stream.empty
>>> def print_first(x): print("called"); return x
>>> s2 = Stream(1, lambda: print_first(Stream(2)))
>>> s2.rest.first
called
2
>>> s2.rest.first # .rest only computed first time called
2
```

# Examples

**An infinite stream of the same value.**

```
def make_const_stream(x):  
    """An infinite stream of X's."""  
    return Stream(x, lambda: make_const_stream(x))
```

**The positive integers (all of them)**

```
def make_integer_stream(first=1):  
    """The infinite stream FIRST, FIRST+1, ..."""  
    def compute_rest():  
        return make_integer_stream(first+1)  
    return Stream(first, compute_rest)
```

```
>>> ints = make_integer_stream(1)
```

```
>>> ints.first
```

```
1
```

```
>>> ints.rest.first
```

```
2
```

# Mapping Streams

Familiar operations on other sequences can be extended to streams:

```
def map_stream(fn, s):
    """Stream of values of FN applied to the elements of stream S.
    if s is Stream.empty:
        return s
    def compute_rest():
        return map_stream(fn, s.rest)
    return Stream(fn(s.first), compute_rest)

def add_streams(s0, s1):
    """Stream of the sums of respective elements of S0 and S1."
    def compute_rest():
        return add_streams(s0.rest, s1.rest)
    if s0 is Stream.empty or s1 is Stream.empty:
        return Stream.empty
    else:
        return Stream(s0.first + s1.first, compute_rest)
```

# Filtering Streams

Another example:

```
def filter_stream(fn, s):
    """Return a stream of the elements of S for which FN is true."""
    if s is Stream.empty:
        return s
    def compute_rest():
        return filter_stream(fn, s.rest)
    if fn(s.first):
        return Stream(s.first, compute_rest)
    return compute_rest()
```

# Streams to Lists

To look at streams a bit more conveniently, let's also define:

```
def stream_to_list(s, n):  
    """A list containing the elements of stream S,  
    up to a maximum of N."""  
    r = []  
    while n > 0 and s is not Stream.empty:  
        r.append(s.first)  
        s = s.rest  
        n -= 1  
    return r
```

# Finding Primes

```
def primes(pos_stream):
    """Return a stream of members of POS_STREAM that are not
    evenly divisible by any previous members of POS_STREAM.
    POS_STREAM is a stream of increasing positive integers.

    >>> p1 = primes(make_integer_stream(2))
    >>> stream_to_list(p1, 7)
    [2, 3, 5, 7, 11, 13, 17]
    """
    def not_divisible(x):
        return x % pos_stream.first != 0
    def compute_rest():
        return primes(filter_stream(not_divisible, pos_stream.rest))
    return Stream(pos_stream.first, compute_rest)
```

# Recursive Streams

What do you suppose we get from these?

```
c1 = Stream(1, lambda: c1)
stream_to_list(c1, 5)
```

```
f1 = add_streams(c1, Stream(0, lambda: f1))
stream_to_list(f1, 5)
```

```
f2 = Stream(1,
            lambda: Stream(1,
                            lambda: add_streams(f2, f2.rest)))
stream_to_list(f2, 6)
```

# Recursive Streams

What do you suppose we get from these?

```
c1 = Stream(1, lambda: c1)
```

```
stream_to_list(c1, 5)
```

```
[1, 1, 1, 1, 1]
```

```
f1 = add_streams(c1, Stream(0, lambda: f1))
```

```
stream_to_list(f1, 5)
```

```
f2 = Stream(1,
```

```
           lambda: Stream(1,
```

```
                           lambda: add_streams(f2, f2.rest)))
```

```
stream_to_list(f2, 6)
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c1 = Stream(1, lambda: c1)
```

```
stream_to_list(c1, 5)
```

```
[1, 1, 1, 1, 1]
```

```
f1 = add_streams(c1, Stream(0, lambda: f1))
```

```
stream_to_list(f1, 5)
```

```
[1, 2, 3, 4, 5]
```

```
f2 = Stream(1,
```

```
        lambda: Stream(1,
```

```
                        lambda: add_streams(f2, f2.rest)))
```

```
stream_to_list(f2, 6)
```

# Recursive Streams

What do you suppose we get from these?

```
c1 = Stream(1, lambda: c1)
```

```
stream_to_list(c1, 5)
```

```
[1, 1, 1, 1, 1]
```

```
f1 = add_streams(c1, Stream(0, lambda: f1))
```

```
stream_to_list(f1, 5)
```

```
[1, 2, 3, 4, 5]
```

```
f2 = Stream(1,
```

```
           lambda: Stream(1,
```

```
                           lambda: add_streams(f2, f2.rest)))
```

```
stream_to_list(f2, 6)
```

```
[1, 1, 2, 3, 5, 8]
```