

# CS 61A Lecture 11

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Friday, September 26

## Announcements

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- Homework 3 due Wednesday 10/1 @ 11:59pm

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  - Regrades are due by Sunday 9/29 @ 11:59pm
- Guerrilla Section 2 is on Saturday. RSVP on Piazza if you want to come!
- Homework 3 due Wednesday 10/1 @ 11:59pm
  - Homework Party on Monday 9/29, time and place TBD

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  - Typically, around 3 out of 4 students receive A's & B's in 61A
  - Don't fall behind! Come to class (discussion, lab, & office hours)!
  - Regrades are due by Sunday 9/29 @ 11:59pm
- Guerrilla Section 2 is on Saturday. RSVP on Piazza if you want to come!
- Homework 3 due Wednesday 10/1 @ 11:59pm
  - Homework Party on Monday 9/29, time and place TBD
- Optional Hog Contest due Wednesday 10/1 @ 11:59pm

# Sequences

## The Sequence Abstraction

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red, orange, yellow, green, blue, indigo, violet.

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There isn't just one sequence class or data abstraction (in Python or in general).



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The sequence abstraction is a collection of behaviors:

**Length.** A sequence has a finite length.

**Element selection.** A sequence has an element corresponding to any non-negative integer index less than its length, starting at 0.

## The Sequence Abstraction

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red, orange, yellow, green, blue, indigo, violet.

0 , 1 , 2 , 3 , 4 , 5 , 6 .

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There is built-in syntax associated with this behavior, or we can use functions.

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The sequence abstraction is a collection of behaviors:

**Length.** A sequence has a finite length.

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There is built-in syntax associated with this behavior, or we can use functions.

A list is a kind of built-in sequence

# Lists

```
['Demo']
```

## Lists are Sequences

---

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---

```
>>> digits = [1, 8, 2, 8]
```



## Lists are Sequences

---

```
>>> digits = [1, 8, 2, 8]
>>> len(digits)
4
```

## Lists are Sequences

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```
>>> digits = [1, 8, 2, 8]
>>> len(digits)
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>>> digits[3]
8
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## Lists are Sequences

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>>> digits = [1, 8, 2, 8]
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4
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```

**Length.** A sequence has a finite length.

**Element selection.** A sequence has an element corresponding to any non-negative integer index less than its length, starting at 0.

```
>>> [2, 7] + digits * 2
[2, 7, 1, 8, 2, 8, 1, 8, 2, 8]
```

## Lists are Sequences

---

```
>>> digits = [1, 8, 2, 8]
>>> len(digits)
4
>>> digits[3]
8
```

**Length.** A sequence has a finite length.

**Element selection.** A sequence has an element corresponding to any non-negative integer index less than its length, starting at 0.

```
>>> [2, 7] + digits * 2
[2, 7, 1, 8, 2, 8, 1, 8, 2, 8]

>>> pairs = [[10, 20], [30, 40]]
```

## Lists are Sequences

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```
>>> digits = [1, 8, 2, 8]
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4
>>> digits[3]
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**Length.** A sequence has a finite length.

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```
>>> [2, 7] + digits * 2
[2, 7, 1, 8, 2, 8, 1, 8, 2, 8]

>>> pairs = [[10, 20], [30, 40]]
>>> pairs[1]
[30, 40]
```

## Lists are Sequences

---

```
>>> digits = [1, 8, 2, 8]
>>> len(digits)
4
>>> digits[3]
8
```

**Length.** A sequence has a finite length.

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```
>>> [2, 7] + digits * 2
[2, 7, 1, 8, 2, 8, 1, 8, 2, 8]

>>> pairs = [[10, 20], [30, 40]]
>>> pairs[1]
[30, 40]
>>> pairs[1][0]
30
```

# For Statements

(Demo)



## Sequence Iteration

---

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```
def count(s, value):  
    total = 0  
    for element in s:  
  
        if element == value:  
            total = total + 1  
    return total
```

## Sequence Iteration

---

```
def count(s, value):  
    total = 0  
    for element in s:  
        if element == value:  
            total = total + 1  
    return total
```

Name bound in the first frame  
of the current environment  
(not a new frame)

## For Statement Execution Procedure

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```
for <name> in <expression>:  
    <suite>
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2. For each element in that sequence, in order:

## For Statement Execution Procedure

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```
for <name> in <expression>:  
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1. Evaluate the header <expression>, which must yield an iterable value (a sequence)
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  - A. Bind <name> to that element in the current frame



## For Statement Execution Procedure

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```
for <name> in <expression>:  
    <suite>
```

1. Evaluate the header <expression>, which must yield an iterable value (a sequence)
2. For each element in that sequence, in order:
  - A. Bind <name> to that element in the current frame
  - B. Execute the <suite>

## Sequence Unpacking in For Statements

---

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```
>>> pairs = [[1, 2], [2, 2], [3, 2], [4, 4]]
```

```
>>> same_count = 0
```

## Sequence Unpacking in For Statements

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A sequence of  
fixed-length sequences

```
>>> pairs = [[1, 2], [2, 2], [3, 2], [4, 4]]
```

```
>>> same_count = 0
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## Sequence Unpacking in For Statements

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A sequence of  
fixed-length sequences

```
>>> pairs = [[1, 2], [2, 2], [3, 2], [4, 4]]
```

```
>>> same_count = 0
```

```
>>> for x, y in pairs:  
...     if x == y:  
...         same_count = same_count + 1
```

```
>>> same_count  
2
```

## Sequence Unpacking in For Statements

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A sequence of  
fixed-length sequences

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>>> pairs = [[1, 2], [2, 2], [3, 2], [4, 4]]
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>>> same_count = 0
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A name for each element in a  
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>>> for x, y in pairs:  
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>>> same_count  
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## Sequence Unpacking in For Statements

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A sequence of  
fixed-length sequences

```
>>> pairs = [[1, 2], [2, 2], [3, 2], [4, 4]]
```

```
>>> same_count = 0
```

A name for each element in a  
fixed-length sequence

Each name is bound to a value, as in  
multiple assignment

```
>>> for x, y in pairs:  
...     if x == y:  
...         same_count = same_count + 1
```

```
>>> same_count  
2
```

Ranges



## The Range Type

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A range is a sequence of consecutive integers.\*

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\* Ranges can actually represent more general integer sequences.

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`..., -5, -4, -3, -2, -1, 0, 1, 2, 3, 4, 5, ...`

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A range is a sequence of consecutive integers.\*

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`range(-2, 2)`

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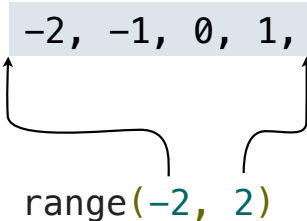
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**Length:** ending value - starting value

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**Length:** ending value - starting value

**Element selection:** starting value + index

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range(-2, 2)

**Length:** ending value - starting value

**Element selection:** starting value + index

```
>>> list(range(-2, 2))  
[-2, -1, 0, 1]
```

```
>>> list(range(4))  
[0, 1, 2, 3]
```

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A range is a sequence of consecutive integers.\*

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**Length:** ending value - starting value

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```
>>> list(range(-2, 2))  
[-2, -1, 0, 1]
```

List constructor

```
>>> list(range(4))  
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**Length:** ending value - starting value

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>>> list(range(-2, 2))  
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Range with a 0 starting value

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## The Range Type

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A range is a sequence of consecutive integers.\*

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range(-2, 2)

**Length:** ending value - starting value

(Demo)

**Element selection:** starting value + index

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>>> list(range(-2, 2))  
[-2, -1, 0, 1]
```

List constructor

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>>> list(range(4))  
[0, 1, 2, 3]
```

Range with a 0 starting value

\* Ranges can actually represent more general integer sequences.

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# List Comprehensions

## List Comprehensions

```
>>> letters = ['a', 'b', 'c', 'd', 'e', 'f', 'm', 'n', 'o', 'p']  
>>> [letters[i] for i in [3, 4, 6, 8]]
```

## List Comprehensions

```
>>> letters = ['a', 'b', 'c', 'd', 'e', 'f', 'm', 'n', 'o', 'p']  
>>> [letters[i] for i in [3, 4, 6, 8]]
```

```
['d', 'e', 'm', 'o']
```



## List Comprehensions

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```
[<map exp> for <name> in <iter exp> if <filter exp>]
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Short version: [`<map exp> for <name> in <iter exp>`]

## List Comprehensions

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```
[<map exp> for <name> in <iter exp> if <filter exp>]
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```
Short version: [<map exp> for <name> in <iter exp>]
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A combined expression that evaluates to a list using this evaluation procedure:

## List Comprehensions

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```
[<map exp> for <name> in <iter exp> if <filter exp>]
```

```
Short version: [<map exp> for <name> in <iter exp>]
```

A combined expression that evaluates to a list using this evaluation procedure:

1. Add a new frame with the current frame as its parent

## List Comprehensions

---

```
[<map exp> for <name> in <iter exp> if <filter exp>]
```

```
Short version: [<map exp> for <name> in <iter exp>]
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A combined expression that evaluates to a list using this evaluation procedure:

1. Add a new frame with the current frame as its parent
2. Create an empty *result list* that is the value of the expression

## List Comprehensions

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```
[<map exp> for <name> in <iter exp> if <filter exp>]
```

```
Short version: [<map exp> for <name> in <iter exp>]
```

A combined expression that evaluates to a list using this evaluation procedure:

1. Add a new frame with the current frame as its parent
2. Create an empty *result list* that is the value of the expression
3. For each element in the iterable value of `<iter exp>`:

## List Comprehensions

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```
[<map exp> for <name> in <iter exp> if <filter exp>]
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1. Add a new frame with the current frame as its parent
2. Create an empty *result list* that is the value of the expression
3. For each element in the iterable value of `<iter exp>`:
  - A. Bind `<name>` to that element in the new frame from step 1



## List Comprehensions

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```
[<map exp> for <name> in <iter exp> if <filter exp>]
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Short version: [<map exp> for <name> in <iter exp>]
```

A combined expression that evaluates to a list using this evaluation procedure:

1. Add a new frame with the current frame as its parent
2. Create an empty *result list* that is the value of the expression
3. For each element in the iterable value of `<iter exp>`:
  - A. Bind `<name>` to that element in the new frame from step 1
  - B. If `<filter exp>` evaluates to a true value, then add the value of `<map exp>` to the result list

## Higher-Order Sequence Functions

## Functions that Perform List Comprehensions

---

## Functions that Perform List Comprehensions

---

```
def apply_to_all(map_fn, s):  
    """Apply map_fn to each element of s.  
  
    """  
    return [map_fn(x) for x in s]
```

## Functions that Perform List Comprehensions

---

```
def apply_to_all(map_fn, s):  
    """Apply map_fn to each element of s.  
        lambda x: x*3  
    """  
    return [map_fn(x) for x in s]
```

## Functions that Perform List Comprehensions

---

```
def apply_to_all(map_fn, s):  
    """Apply map_fn to each element of s.  
  
    >>> apply_to_all(lambda x: x*3, range(5))  
    [0, 3, 6, 9, 12]  
    """  
    return [map_fn(x) for x in s]
```

## Functions that Perform List Comprehensions

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def apply_to_all(map_fn, s):  
    """Apply map_fn to each element of s.  
  
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    return [map_fn(x) for x in s]
```

0, 1, 2, 3, 4

$\lambda x: x*3$

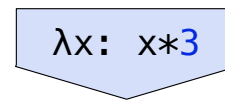
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## Functions that Perform List Comprehensions

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    """  
    return [map_fn(x) for x in s]
```

0, 1, 2, 3, 4



0, 3, 6, 9, 12

```
def keep_if(filter_fn, s):  
    """List all elements x of s for which filter_fn(x) is true.  
  
    """  
    return [x for x in s if filter_fn(x)]
```

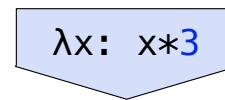


## Functions that Perform List Comprehensions

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0, 1, 2, 3, 4



0, 3, 6, 9, 12

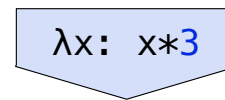
```
def keep_if(filter_fn, s):  
    """List all elements x of s for which filter_fn(x) is true.  
  
        lambda x: x>5  
  
    """  
    return [x for x in s if filter_fn(x)]
```

## Functions that Perform List Comprehensions

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    return [map_fn(x) for x in s]
```

0, 1, 2, 3, 4



0, 3, 6, 9, 12

```
def keep_if(filter_fn, s):  
    """List all elements x of s for which filter_fn(x) is true.  
  
    >>> keep_if(lambda x: x>5, range(10))  
    [6, 7, 8, 9]  
    """  
    return [x for x in s if filter_fn(x)]
```

## Functions that Perform List Comprehensions

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```
def apply_to_all(map_fn, s):  
    """Apply map_fn to each element of s.  
  
    >>> apply_to_all(lambda x: x*3, range(5))  
    [0, 3, 6, 9, 12]  
    """  
    return [map_fn(x) for x in s]
```

0, 1, 2, 3, 4

$\lambda x: x*3$

0, 3, 6, 9, 12

```
def keep_if(filter_fn, s):  
    """List all elements x of s for which filter_fn(x) is true.  
  
    >>> keep_if(lambda x: x>5, range(10))  
    [6, 7, 8, 9]  
    """  
    return [x for x in s if filter_fn(x)]
```

0, 1, 2, 3, 4,  
5, 6, 7, 8, 9

$\lambda x: x>5$

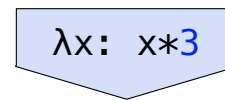
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## Functions that Perform List Comprehensions

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```
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    return [map_fn(x) for x in s]
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0, 1, 2, 3, 4

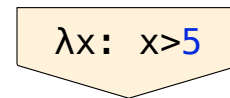


0, 3, 6, 9, 12

Same number  
of different  
elements

```
def keep_if(filter_fn, s):  
    """List all elements x of s for which filter_fn(x) is true.  
  
    >>> keep_if(lambda x: x>5, range(10))  
    [6, 7, 8, 9]  
    """  
    return [x for x in s if filter_fn(x)]
```

0, 1, 2, 3, 4,  
5, 6, 7, 8, 9



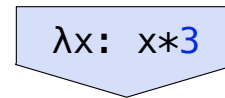
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## Functions that Perform List Comprehensions

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```
def apply_to_all(map_fn, s):  
    """Apply map_fn to each element of s.  
  
    >>> apply_to_all(lambda x: x*3, range(5))  
    [0, 3, 6, 9, 12]  
    """  
    return [map_fn(x) for x in s]
```

0, 1, 2, 3, 4

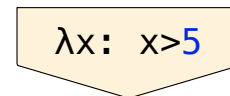


0, 3, 6, 9, 12

Same number  
of different  
elements

```
def keep_if(filter_fn, s):  
    """List all elements x of s for which filter_fn(x) is true.  
  
    >>> keep_if(lambda x: x>5, range(10))  
    [6, 7, 8, 9]  
    """  
    return [x for x in s if filter_fn(x)]
```

0, 1, 2, 3, 4,  
5, 6, 7, 8, 9



6, 7, 8, 9

Smaller number  
of same elements

## Reducing a Sequence to a Value

---

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```
def reduce(reduce_fn, s, initial):  
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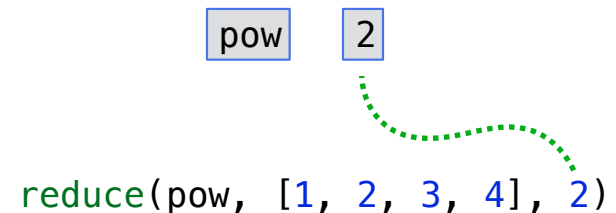
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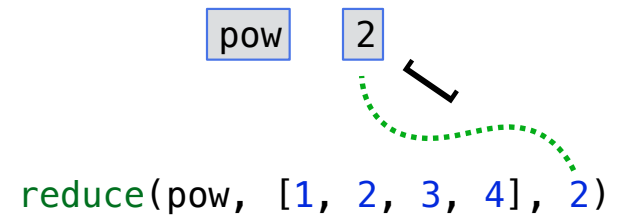
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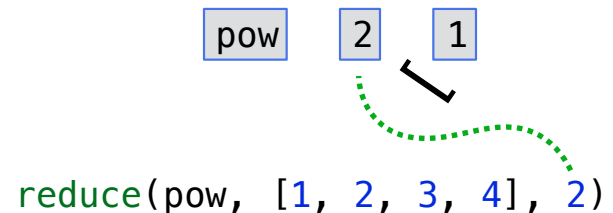
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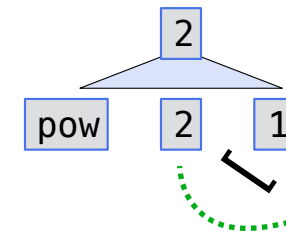
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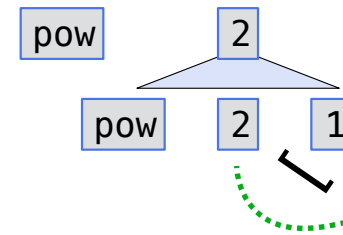
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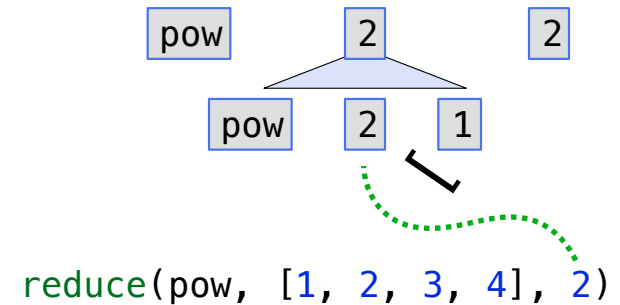
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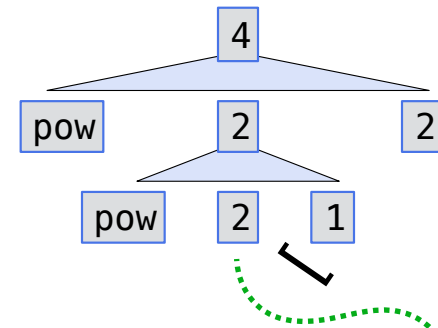
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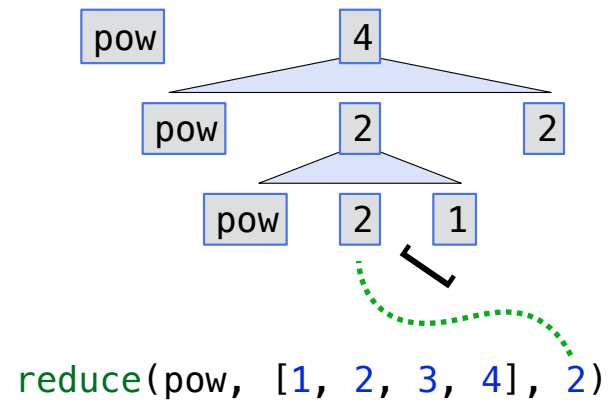
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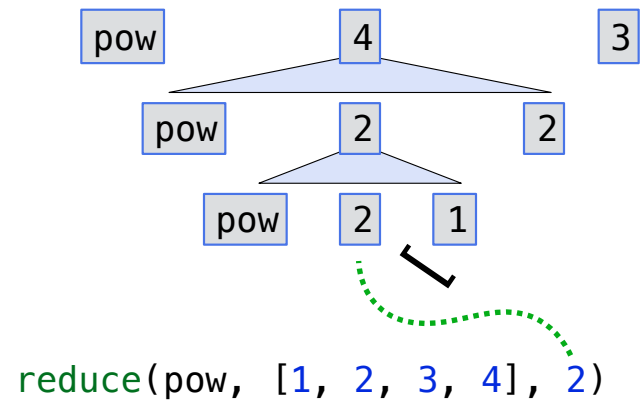
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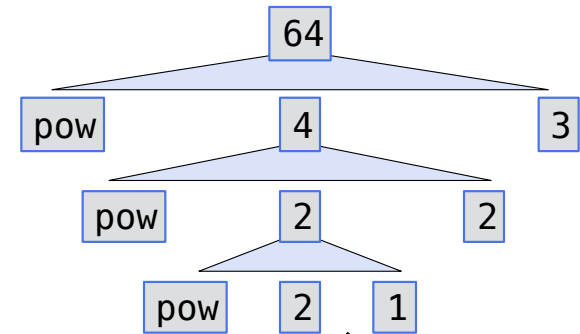
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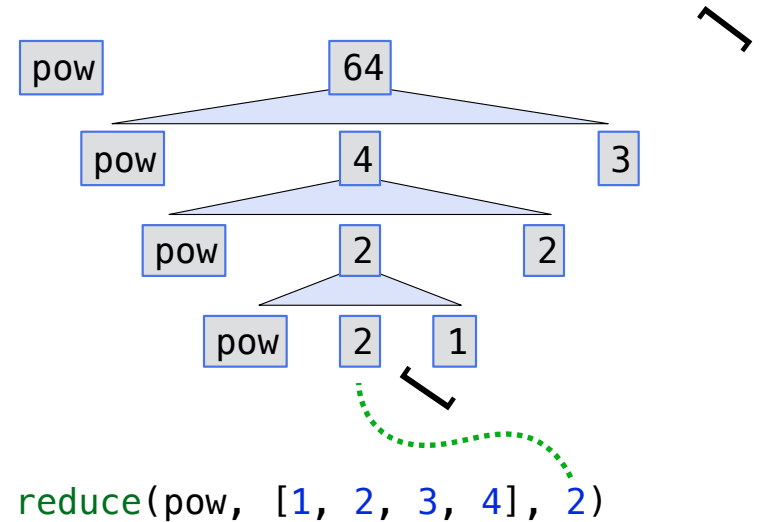
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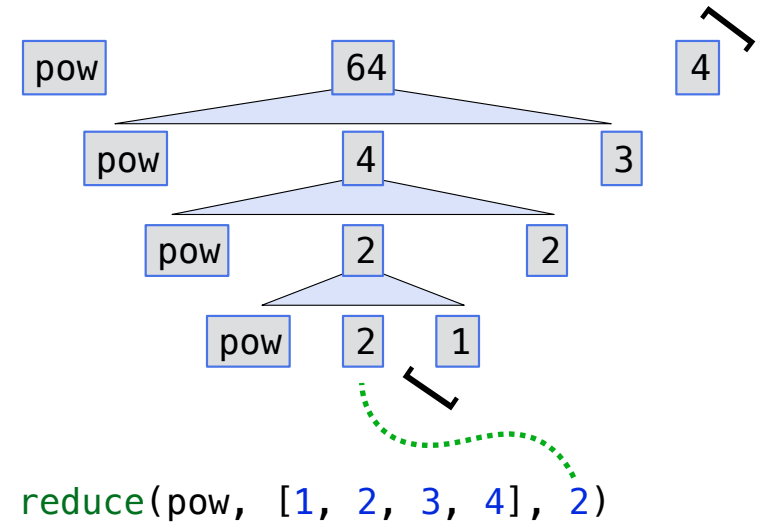
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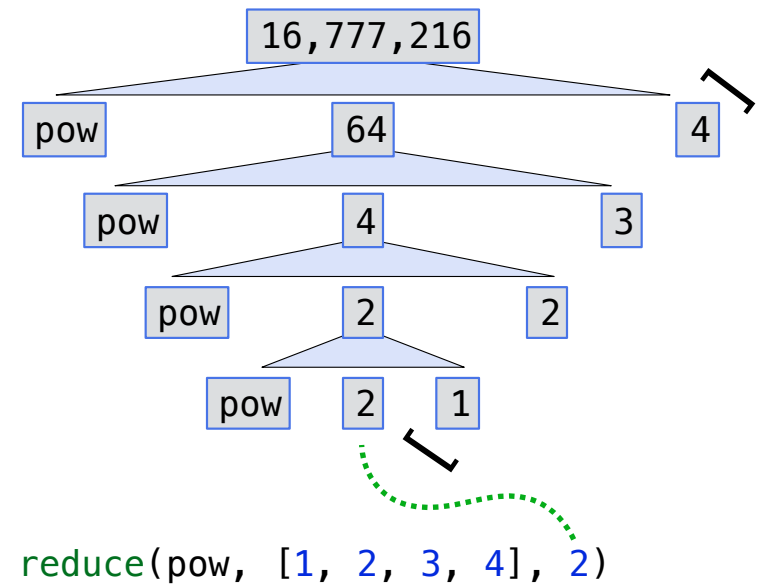


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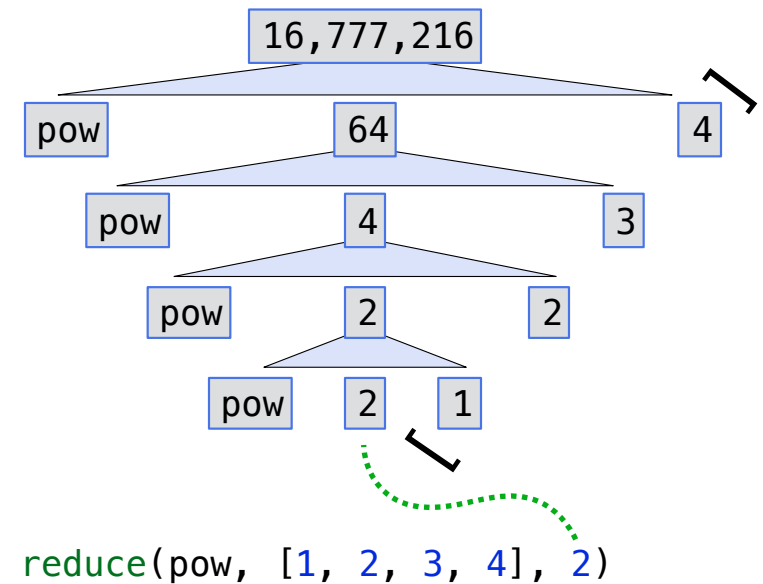
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(Demo)



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Most Python programmers just use list comprehensions