

How to sort anything

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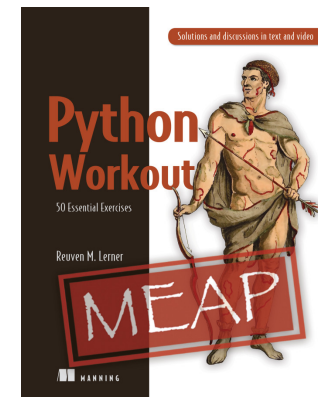
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I teach Python

- Corporate training
- Video courses about Python + Git
- Weekly Python Exercise
 - More info at <https://lerner.co.il/>



- “Python Workout” — published by Manning
- <https://PythonWorkout.com>



- “Better developers” — free, weekly newsletter about Python
 - <https://BetterDevelopersWeekly.com/>

Sorting is important!

Why sort?

- Display data nicely
- Make messy data (slightly) less messy
- Find the largest (or smallest) value in a collection
- See which products sold best (or worst)
- Which supplier's proposal will cost you the most?
- Find the closest gas station to your current location
- Find the a similar films to the one you've just watched
- Find the most similar products to the one you're looking at

Python makes sorting easy

- If you have a list, then you can use the “sort” method:

```
mylist = [10, 5, -3, 7, -2, 4]
print(f'Before, {mylist=}')
mylist.sort()
print(f'After, {mylist=}')
```

Before, mylist=[10, 5, -3, 7, -2, 4]

After, mylist=[-3, -2, 4, 5, 7, 10]

About list.sort

- It's a list method, so it only works on lists
- It sorts from smallest to largest (by default)
- It changes the list object itself!

```
mylist = [10, 5, -3, 7, -2, 4]  
also_mylist = mylist
```

```
print(f'Before, {also_mylist=}')  
mylist.sort()  
print(f'After, {also_mylist=}')
```

```
Before, also_mylist=[10, 5, -3, 7, -2, 4]
```

```
After, also_mylist=[-3, -2, 4, 5, 7, 10]
```

list.sort returns None

```
mylist = [10, 5, -3, 7, -2, 4]
print(f'Before, {mylist=}')
mylist = mylist.sort()
print(f'After, {mylist=}')
```

Before, mylist=[10, 5, -3, 7, -2, 4]
After, mylist=None

Better than `list.sort`: `sorted`

- A builtin function (not a method)
- Works with all iterables — not just lists!
- Always returns a list, sorted lowest to highest (by default)
- Doesn't modify the source data at all

Using sorted

```
mylist = [10, 5, -3, 7, -2, 4]
```

```
print(sorted(mylist))
```

```
print(f'After, {mylist=}')
```

```
[-3, -2, 4, 5, 7, 10]
```

```
After, mylist=[10, 5, -3, 7, -2, 4]
```

How is this all being sorted?

- What sort algorithm is being used here?
- Hint: It was invented by Tim Peters.
- That's right: Timsort!
- Timsort assumes that real-world data contains “natural runs”
 - Given some runs, Timsort merges them
 - If there aren't any runs, then it uses insertion sort to add them
- In this way, Timsort is a mix of merge and insertion sorts

Comparing items

- Given items A and B, we'll thus need to know which is true:
 - $A < B$
 - $A > B$
 - $A == B$
- When merging or inserting, Timsort will rely on this comparison
- If we have a sequence of numbers, then we can just use Python's $<$, $>$, and $==$ operators. And indeed, we saw that earlier!

Sorting a list of strings

```
words = 'this is a bunch of words'.split()
```

```
print(sorted(words))
```

```
['a', 'bunch', 'is', 'of', 'this', 'words']
```

How does this work?

- One-character strings can be compared with $<$
 - The comparison is based on the Unicode code point for the one-character string (i.e., character)
- To compare multi-character strings, we compare the characters at index 0.
 - Does $\text{word}_1[0] < \text{word}_2[0]$? Then word_1 comes first.
 - Does $\text{word}_1[0] > \text{word}_2[0]$? Then word_2 comes first.
- If they're the same, then try again with index 1, continuing until you work your way through the string.
- If they're equal, then return word_1 .
- If one is a substring of the other, then return the shorter string.

Sound familiar?

- If you've ever looked up words in a dictionary, then you've used a version of this algorithm.
- It turns out that this works on all Python sequences!
 - Lists of strings
 - Lists of lists
 - Lists of tuples
- Lists and tuples implement `<` in the same way!

Comparing lists

```
list1 = [10, 20, 30]
```

```
list2 = [10, 20, 15]
```

```
print(list1 < list2)    False
```

```
print(list1 > list2)    True
```

Lists containing different types

```
mylist = [20, 'b', 'a', 10, 30]  
print(sorted(mylist))
```

Traceback (most recent call last):

```
File "./slide7.py", line 3, in <module>  
    print(sorted(mylist))
```

```
TypeError: '<' not supported between  
instances of 'str' and 'int'
```


Reversing the direction

```
mylist = [20, 30, 10]  
print(sorted(mylist, reverse=True))
```

```
[30, 20, 10]
```

Sorting by word length

- What if we want to sort a list of words... but by their lengths?
- We no longer want Timsort to compare this:

`word1 < word2`

- Rather, we want Timsort to compare this:

`len(word1) < len(word2)`

- Note: We don't want to sort the lengths! We want to use the lengths to sort the words.

The “key” parameter

- Given a function “f”, if we want to compare

$f(A) < f(B)$

- We can call “sorted” with “key=f”
- Because we want to sort the words by length, we can call “sorted” with “key=len”

Using “key”

```
words = 'this is a bunch of words'.split()  
print(sorted(words, key=len))
```

```
['a', 'is', 'of', 'this', 'bunch', 'words']
```

What can be a key function?

- Any function that takes a single argument, and returns a value that can be compared with `<`.
- Examples:
 - `sorted(words, key=len)`: Sort words by length
 - `sorted(numbers, key=abs)`: Sort numbers by absolute value
 - `sorted(words, key=str.lower)`: Sort words, ignoring case
- Notice that we can pass a method by passing it as a class attribute.

Don't execute the key function!

- It's a common mistake to use parentheses after the key function's name.

- Bad:

```
sorted(numbers, key=abs())
```

- Good:

```
sorted(numbers, key=abs)
```

- That's because we have to pass a callable (function or class) to "key". "abs" is a function, but the result is an int.. not that it'll work this way...

Sorting lists of lists

- What if I have a list of lists (or a list of tuples), and want to sort them by length?
 - Just use “key=len”
 - (Yes, just like with strings)
- What if I want to sort them by the sum of numbers?
 - Use “key=sum”

Custom key functions

- We can pass our own functions to “key”!
- The function takes one argument, an element in what we’re sorting
- The function’s return value is how that element will be sorted
 - This value must be sortable
 - This value doesn’t need to be of the same type as the input

Example: Sort integers by the number of digits

```
numbers = [500, 2000, 100,  
           1, 30, 1000, 40]
```

```
def by_digit_count(n):  
    return len(str(n))
```

```
print(sorted(numbers,  
             key=by_digit_count))
```

```
[1, 30, 40, 500, 100, 2000, 1000]
```

Sorting sublists by their means

```
numbers = [[5, 7, 3, 4], [2, 4, 6, 7],  
           [1, 3, 5], [10, 1, 1, 1]]
```

```
def by_mean(one_list):  
    return sum(one_list) / len(one_list)
```

```
print(sorted(numbers, key=by_mean))
```

```
[[1, 3, 5], [10, 1, 1, 1],  
 [5, 7, 3, 4], [2, 4, 6, 7]]
```

Sorting by vowels per word

```
words = 'this here is a fascinating,  
scintillating test'.split()
```

```
def by_vowel_count(word):  
    print(f'Checking {word}')  
    total = 0  
    for one_letter in word.lower():  
        if one_letter in 'aeiou':  
            total += 1  
  
    return total  
  
print(sorted(words, key=by_vowel_count))
```

Checking this

Checking here

Checking is

Checking a

Checking fascinating,

Checking scintillating

Checking test

```
['this', 'is', 'a', 'test', 'here',  
'fascinating,', 'scintillating']
```

Sorting filenames by file length

```
import glob
import os

def by_file_length(filename):
    return os.stat(filename).st_size

print(sorted(glob.glob('*.*txt'),
            key=by_file_length))

['nums.txt', 'wcfile.txt',
 'shoe-data.txt', 'linux-etc-passwd.txt',
 'mini-access-log.txt']
```

Sorting filenames by the file's vowel count

```
import glob

def by_vowel_count(filename):
    total = 0
    for one_line in open(filename):
        for one_character in one_line.lower():
            if one_character in 'aeiou':
                total += 1

    return total

print(sorted(glob.glob('*.*txt'),
            key=by_vowel_count))
```

What about a list of dicts?

```
people =
```

```
[{'first': 'Atara', 'last': 'Lerner-Friedman', 'age': 19},  
 {'first': 'Shikma', 'last': 'Lerner-Friedman', 'age': 17},  
 {'first': 'Amotz', 'last': 'Lerner-Friedman', 'age': 14},  
 {'first': 'Reuven', 'last': 'Lerner', 'age': 50}]
```

- Can I sort this list of dicts?

Nope.

Traceback (most recent call last):

```
File "./slide16.py", line 8, in <module>  
    print(sorted(people))
```

```
TypeError: '<' not supported between instances of  
'dict' and 'dict'
```


Solution: A key function!

- For example, we can sort by age:

```
def by_age(d):  
    return d['age']
```

```
print(sorted(people, key=by_age))
```

```
[  
  {'first': 'Amotz', 'last': 'Lerner-Friedman',  
   'age': 14},  
  {'first': 'Shikma', 'last': 'Lerner-Friedman',  
   'age': 17},  
  {'first': 'Atara', 'last': 'Lerner-Friedman',  
   'age': 19},  
  {'first': 'Reuven', 'last': 'Lerner', 'age': 50}  
]
```

Sorting by multiple keys

- What if we want to sort by last name, and then first name?
- Solution: Have the key function return a tuple!
 - Python knows how to sort tuples, after all

```
def by_last_first(d):  
    return d['last'], d['first']
```

```
print(sorted(people, key=by_last_first))
```

```
[  
  {'first': 'Reuven', 'last': 'Lerner', 'age': 50},  
  {'first': 'Amotz', 'last': 'Lerner-Friedman', 'age': 14},  
  {'first': 'Atara', 'last': 'Lerner-Friedman', 'age': 19},  
  {'first': 'Shikma', 'last': 'Lerner-Friedman', 'age': 17}  
]
```

Why write a key function?

- We're defining it, and then using it once.
- We could do better with *lambda*, which returns a function object
- Functions defined with lambda consist of a single expression
- So instead of “key=by_last_first”, we could use:

```
print(sorted(people,  
            key=lambda d: (d['last'],  
                           d['first'])))
```

Using `operator.itemgetter`

- An even more Pythonic approach: `operator.itemgetter`
- It's a function that returns a function!
- To sort “people” by age, we can say:

```
import operator
```

```
print(sorted(people,  
            key=operator.itemgetter('age')))
```

Multiple items

- But we can call it with multiple arguments, too
- So instead of “key=by_last_first”, we can say:

```
import operator
```

```
print(sorted(people,  
            key=operator.itemgetter('last',  
                                     'first')))
```

How can we sort objects?

```
class Person:
    def __init__(self, first, last, age):
        self.first = first
        self.last = last
        self.age = age

people = [Person('Reuven', 'Lerner', 50),
          Person('Atara', 'Lerner-Friedman', 19),
          Person('Shikma', 'Lerner-Friedman', 17),
          Person('Amotz', 'Lerner-Friedman', 14)]

print(sorted(people))
```

Doesn't work

Traceback (most recent call last):

```
File "./slide22.py", line 15, in <module>
```

```
    print(sorted(people))
```

```
TypeError: '<' not supported between instances of  
'Person' and 'Person'
```

Let's implement <!

```
class Person:
    def __init__(self, first, last, age):
        self.first = first
        self.last = last
        self.age = age

    def __lt__(self, other):
        return self.age < other.age

    def __repr__(self):
        return f'Person, {vars(self)}'

people = [Person('Reuven', 'Lerner', 50),
          Person('Atara', 'Lerner-Friedman', 19),
          Person('Shikma', 'Lerner-Friedman', 17),
          Person('Amotz', 'Lerner-Friedman', 14)]

print(sorted(people))
```


Let's create ==, as well

```
class Person:
    def __init__(self, first, last, age):
        self.first = first
        self.last = last
        self.age = age

    def __lt__(self, other):
        return self.age < other.age

    def __eq__(self, other):
        return self.age == other.age

    def __repr__(self):
        return f'Person, {vars(self)}'

people = [Person('Reuven', 'Lerner', 50),
          Person('Atara', 'Lerner-Friedman', 19),
          Person('Shikma', 'Lerner-Friedman', 17),
          Person('Amotz', 'Lerner-Friedman', 14)]

print(sorted(people))
```

Sorting by last + first names

```
class Person:
    def __init__(self, first, last, age):
        self.first = first
        self.last = last
        self.age = age

    def __lt__(self, other):
        return [self.last, self.first] < [other.last, other.first]

    def __eq__(self, other):
        return [self.last, self.first] == [other.last, other.first]

    def __repr__(self):
        return f'Person, {vars(self)}'

people = [Person('Reuven', 'Lerner', 50),
          Person('Atara', 'Lerner-Friedman', 19),
          Person('Shikma', 'Lerner-Friedman', 17),
          Person('Amotz', 'Lerner-Friedman', 14)]

print(sorted(people))
```

What about other comparisons?

```
print(people[1] >= people[0])
```

```
TypeError: '>=' not supported between instances of  
'Person' and 'Person'
```

Using total_ordering

```
import functools

@functools.total_ordering
class Person:
    def __init__(self, first, last, age):
        self.first = first
        self.last = last
        self.age = age

    def __lt__(self, other):
        return [self.last, self.first] < [other.last, other.first]

    def __eq__(self, other):
        return [self.last, self.first] == [other.last, other.first]

    def __repr__(self):
        return f'Person, {vars(self)}'

print(people[1] >= people[0])

True
```

Why work so hard?

- As of Python 3.7, we can use “dataclasses”
- These reduce our code by a *lot*.
- And they can handle sorting, also!

Re-implemented

```
from dataclasses import dataclass
```

```
@dataclass(order=True)
```

```
class Person:
```

```
    first: str
```

```
    last: str
```

```
    age: int
```

```
people = [Person('Reuven', 'Lerner', 50),  
          Person('Atara', 'Lerner-Friedman', 19),  
          Person('Shikma', 'Lerner-Friedman', 17),  
          Person('Amotz', 'Lerner-Friedman', 14)]
```

```
print(sorted(people))
```

```
[Person(first='Amotz', last='Lerner-Friedman', age=14),  
 Person(first='Atara', last='Lerner-Friedman', age=19),  
 Person(first='Reuven', last='Lerner', age=50),  
 Person(first='Shikma', last='Lerner-Friedman', age=17)]
```

Wait a second!

- We didn't get an error...
- ...but how are things being sorted?
- Answer: In the order that attributes were declared!
- Want to modify the sort order? Change your declarations.

Sort by last, first

```
from dataclasses import dataclass
```

```
@dataclass(order=True)
```

```
class Person:
```

```
    last: str
```

```
    first: str
```

```
    age: int
```

```
people = [Person('Lerner', 'Reuven', 50),  
           Person('Lerner-Friedman', 'Atara', 19),  
           Person('Lerner-Friedman', 'Shikma', 17),  
           Person('Lerner-Friedman', 'Amotz', 14)]
```

```
print(sorted(people))
```

```
[Person(last='Lerner', first='Reuven', age=50),  
 Person(last='Lerner-Friedman', first='Amotz', age=14),  
 Person(last='Lerner-Friedman', first='Atara', age=19),  
 Person(last='Lerner-Friedman', first='Shikma', age=17)]
```


Summary

- Python's "sorted" function lets you sort *anything*
- The key to this working is the "key function"
 - Any function or method that takes a single input and returns a sortable output
 - Write your own function
 - Use lambda
 - Use `operator.itemgetter` with one or more arguments
- Classes are sortable if they define some magic methods
- Dataclasses make it even easier!

Questions or comments?

- E-mail me: reuven@lerner.co.il
- Follow me on Twitter: [@reuvenmlerner](https://twitter.com/reuvenmlerner)
- See you next year... in person, I hope!