June 27, 2020 / Jure Šorn

Comprehensive Python Cheatsheet

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Contents

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                       NumPy, Image, Audio, Games, Data]
}
```

Main

```
if __name__ == '__main__':     # Runs main() if file wasn't imported.
    main()
```

List

```
<list> = <list>[from_inclusive : to_exclusive : ±step_size]
```

```
<list>.append(<el>)            # Or: <list> += [<el>]
<list>.extend(<collection>)    # Or: <list> += <collection>
```

```
<list>.sort()
<list>.reverse()
<list> = sorted(<collection>)
<iter> = reversed(<list>)
```

```
sum_of_elements  = sum(<collection>)
elementwise_sum  = [sum(pair) for pair in zip(list_a, list_b)]
sorted_by_second = sorted(<collection>, key=lambda el: el[1])
sorted_by_both   = sorted(<collection>, key=lambda el: (el[1], el[0]))
flatter_list     = list(itertools.chain.from_iterable(<list>))
product_of_elems = functools.reduce(lambda out, el: out * el, <collection>)
list_of_chars    = list(<str>)
```

- **Module operator provides functions itemgetter() and mul() that offer the same functionality as lambda expressions above.**

```
<int> = <list>.count(<el>)     # Returns number of occurrences. Also works on strings.
index = <list>.index(<el>)     # Returns index of first occurrence or raises ValueError.
<list>.insert(index, <el>)     # Inserts item at index and moves the rest to the right.
<el> = <list>.pop([index])     # Removes and returns item at index or from the end.
<list>.remove(<el>)            # Removes first occurrence of item or raises ValueError.
<list>.clear()                 # Removes all items. Also works on dictionary and set.
```

Dictionary

```
<view> = <dict>.keys()                          # Coll. of keys that reflects changes.
<view> = <dict>.values()                        # Coll. of values that reflects changes.
<view> = <dict>.items()                         # Coll. of key-value tuples that reflects chgs.
```

```
value  = <dict>.get(key, default=None)          # Returns default if key is missing.
value  = <dict>.setdefault(key, default=None)   # Returns and writes default if key is missing.
<dict> = collections.defaultdict(<type>)        # Creates a dict with default value of type.
<dict> = collections.defaultdict(lambda: 1)     # Creates a dict with default value 1.
```

```
<dict> = dict(<collection>)                     # Creates a dict from coll. of key-value pairs.
<dict> = dict(zip(keys, values))                # Creates a dict from two collections.
<dict> = dict.fromkeys(keys [, value])          # Creates a dict from collection of keys.
```

```
<dict>.update(<dict>)                           # Adds items. Replaces ones with matching keys.
value = <dict>.pop(key)                         # Removes item or raises KeyError.
{k for k, v in <dict>.items() if v == value}    # Returns set of keys that point to the value.
{k: v for k, v in <dict>.items() if k in keys}  # Returns a dictionary, filtered by keys.
```

Counter

```
>>> from collections import Counter
>>> colors = ['blue', 'blue', 'blue', 'red', 'red']
>>> counter = Counter(colors)
>>> counter['yellow'] += 1
Counter({'blue': 3, 'red': 2, 'yellow': 1})
>>> counter.most_common()[0]
('blue', 3)
```

Set

```
<set> = set()
```

```
<set>.add(<el>)                                 # Or: <set> |= {<el>}
<set>.update(<collection>)                      # Or: <set> |= <set>
```

```
<set>  = <set>.union(<coll.>)                   # Or: <set> | <set>
<set>  = <set>.intersection(<coll.>)            # Or: <set> & <set>
<set>  = <set>.difference(<coll.>)              # Or: <set> - <set>
<set>  = <set>.symmetric_difference(<coll.>)    # Or: <set> ^ <set>
<bool> = <set>.issubset(<coll.>)                # Or: <set> <= <set>
<bool> = <set>.issuperset(<coll.>)              # Or: <set> >= <set>
```

```
<el> = <set>.pop()                              # Raises KeyError if empty.
<set>.remove(<el>)                              # Raises KeyError if missing.
<set>.discard(<el>)                             # Doesn't raise an error.
```

Frozen Set

- **Is immutable and hashable.**
- **That means it can be used as a key in a dictionary or as an element in a set.**

```
<frozenset> = frozenset(<collection>)
```

Tuple

Tuple is an immutable and hashable list.

```
<tuple> = ()
<tuple> = (<el>, )
<tuple> = (<el_1>, <el_2> [, ...])
```

Named Tuple

Tuple's subclass with named elements.

```
>>> from collections import namedtuple
>>> Point = namedtuple('Point', 'x y')
>>> p = Point(1, y=2)
Point(x=1, y=2)
>>> p[0]
1
>>> p.x
1
>>> getattr(p, 'y')
2
>>> p._fields  # Or: Point._fields
('x', 'y')
```

Range

```
<range> = range(to_exclusive)
<range> = range(from_inclusive, to_exclusive)
<range> = range(from_inclusive, to_exclusive, ±step_size)
```

```
from_inclusive = <range>.start
to_exclusive   = <range>.stop
```

Enumerate

```
for i, el in enumerate(<collection> [, i_start]):
    ...
```

Iterator

```
<iter> = iter(<collection>)                 # `iter(<iter>)` returns unmodified iterator.
<iter> = iter(<function>, to_exclusive)     # A sequence of return values until 'to_exclusive'.
<el>   = next(<iter> [, default])           # Raises StopIteration or returns 'default' on end.
<list> = list(<iter>)                       # Returns a list of iterator's remaining elements.
```

Itertools

```
from itertools import count, repeat, cycle, chain, islice
```

```
<iter> = count(start=0, step=1)             # Returns updated value endlessly. Accepts floats.
<iter> = repeat(<el> [, times])             # Returns element endlessly or 'times' times.
<iter> = cycle(<collection>)                # Repeats the sequence endlessly.
```

```
<iter> = chain(<coll_1>, <coll_2> [, ...])  # Empties collections in order.
<iter> = chain.from_iterable(<collection>)  # Empties collections inside a collection in order.
```

```
<iter> = islice(<collection>, to_exclusive)
<iter> = islice(<collection>, from_inclusive, to_exclusive [, +step_size])
```

Generator

- **Any function that contains a yield statement returns a generator.**
- **Generators and iterators are interchangeable.**

```
def count(start, step):
    while True:
        yield start
        start += step
```

```
>>> counter = count(10, 2)
>>> next(counter), next(counter), next(counter)
(10, 12, 14)
```

Type

- **Everything is an object.**
- **Every object has a type.**
- **Type and class are synonymous.**

```
<type> = type(<el>)                          # Or: <el>.__class__
<bool> = isinstance(<el>, <type>)            # Or: issubclass(type(<el>), <type>)
```

```
>>> type('a'), 'a'.__class__, str
(<class 'str'>, <class 'str'>, <class 'str'>)
```

Some types do not have built-in names, so they must be imported:

```
from types import FunctionType, MethodType, LambdaType, GeneratorType
```

Abstract Base Classes

Each abstract base class specifies a set of virtual subclasses. These classes are then recognized by isinstance() and issubclass() as subclasses of the ABC, although they are really not.

```
>>> from collections.abc import Sequence, Collection, Iterable
>>> isinstance([1, 2, 3], Iterable)
True
```

	Sequence	Collection	Iterable
list, range, str	✓	✓	✓
dict, set		✓	✓
iter			✓

```
>>> from numbers import Integral, Rational, Real, Complex, Number
>>> isinstance(123, Number)
True
```

	Integral	Rational	Real	Complex	Number
int	✓	✓	✓	✓	✓
fractions.Fraction		✓	✓	✓	✓
float			✓	✓	✓
complex				✓	✓
decimal.Decimal					✓

String

```
<str>  = <str>.strip()                      # Strips all whitespace characters from both ends.
<str>  = <str>.strip('<chars>')             # Strips all passed characters from both ends.
```

```
<list> = <str>.split()                      # Splits on one or more whitespace characters.
<list> = <str>.split(sep=None, maxsplit=-1) # Splits on 'sep' str at most 'maxsplit' times.
<list> = <str>.splitlines(keepends=False)   # Splits on \n,\r,\r\n. Keeps them if 'keepends'.
<str>  = <str>.join(<coll_of_strings>)      # Joins elements using string as separator.
```

```
<bool> = <sub_str> in <str>                 # Checks if string contains a substring.
<bool> = <str>.startswith(<sub_str>)        # Pass tuple of strings for multiple options.
<bool> = <str>.endswith(<sub_str>)          # Pass tuple of strings for multiple options.
<int>  = <str>.find(<sub_str>)              # Returns start index of first match or -1.
<int>  = <str>.index(<sub_str>)             # Same but raises ValueError if missing.
```

```
<str>  = <str>.replace(old, new [, count])  # Replaces 'old' with 'new' at most 'count' times.
<str>  = <str>.translate(<table>)           # Use `str.maketrans(<dict>)` to generate table.
```

```
<str>  = chr(<int>)                         # Converts int to Unicode char.
<int>  = ord(<str>)                         # Converts Unicode char to int.
```

- Also: `'lstrip()'`, `'rstrip()'`.
- Also: `'lower()'`, `'upper()'`, `'capitalize()'` and `'title()'`.

Property Methods

	[!#$%…]	[a-zA-Z]	[¼½¾]	[²³¹]	[0-9]
isprintable()	✓	✓	✓	✓	✓
isalnum()		✓	✓	✓	✓
isnumeric()			✓	✓	✓
isdigit()				✓	✓
isdecimal()					✓

- **Also: `'isspace()'` checks for `'[ \t\n\r\f\v…]'`.**

Regex

```
import re
<str>   = re.sub(<regex>, new, text, count=0)  # Substitutes all occurrences with 'new'.
<list>  = re.findall(<regex>, text)            # Returns all occurrences as strings.
<list>  = re.split(<regex>, text, maxsplit=0)  # Use brackets in regex to include the matches.
<Match> = re.search(<regex>, text)             # Searches for first occurrence of the pattern.
<Match> = re.match(<regex>, text)              # Searches only at the beginning of the text.
<iter>  = re.finditer(<regex>, text)           # Returns all occurrences as match objects.
```

- **Search() and match() return None if they can't find a match.**
- **Argument `'flags=re.IGNORECASE'` can be used with all functions.**
- **Argument `'flags=re.MULTILINE'` makes `'^'` and `'$'` match the start/end of each line.**
- **Argument `'flags=re.DOTALL'` makes dot also accept the `'\n'`.**
- **Use `r'\1'` or `'\\1'` for backreference.**
- **Add `'?'` after an operator to make it non-greedy.**

Match Object

```
<str>   = <Match>.group()                  # Returns the whole match. Also group(0).
<str>   = <Match>.group(1)                 # Returns part in the first bracket.
<tuple> = <Match>.groups()                 # Returns all bracketed parts.
<int>   = <Match>.start()                  # Returns start index of the match.
<int>   = <Match>.end()                    # Returns exclusive end index of the match.
```

Special Sequences

- **By default digits, alphanumerics and whitespaces from all alphabets are matched, unless `'flags=re.ASCII'` argument is used.**
- **Use a capital letter for negation.**

```
'\d' == '[0-9]'                            # Matches any digit.
'\w' == '[a-zA-Z0-9_]'                     # Matches any alphanumeric.
'\s' == '[ \t\n\r\f\v]'                    # Matches any whitespace.
```

Format

```
<str> = f'{<el_1>}, {<el_2>}'
<str> = '{}, {}'.format(<el_1>, <el_2>)
```

Attributes

```
>>> from collections import namedtuple
>>> Person = namedtuple('Person', 'name height')
>>> person = Person('Jean-Luc', 187)
>>> f'{person.height}'
'187'
>>> '{p.height}'.format(p=person)
'187'
```

General Options

```
{<el>:<10}                                  # '<el>      '
{<el>:^10}                                  # '   <el>   '
{<el>:>10}                                  # '      <el>'
{<el>:.<10}                                 # '<el>......'
{<el>:<0}                                   # '<el>'
```

Strings

`'!r'` calls object's repr() method, instead of str(), to get a string.

```
{'abcde'!r:10}                              # "'abcde'   "
{'abcde':10.3}                              # 'abc       '
{'abcde':.3}                                # 'abc'
```

Numbers

```
{ 123456:10,}                               # '   123,456'
{ 123456:10_}                               # '   123_456'
{ 123456:+10}                               # '   +123456'
{-123456:=10}                               # '-   123456'
{ 123456: }                                 # ' 123456'
{-123456: }                                 # '-123456'
```

Floats

```
{1.23456:10.3}                              # '      1.23'
{1.23456:10.3f}                             # '     1.235'
{1.23456:10.3e}                             # ' 1.235e+00'
{1.23456:10.3%}                             # '  123.456%'
```

Comparison of presentation types:

	{<float>}	{<float>:f}	{<float>:e}	{<float>:%}
0.000056789	'5.6789e-05'	'0.000057'	'5.678900e-05'	'0.005679%'
0.00056789	'0.00056789'	'0.000568'	'5.678900e-04'	'0.056789%'
0.0056789	'0.0056789'	'0.005679'	'5.678900e-03'	'0.567890%'
0.056789	'0.056789'	'0.056789'	'5.678900e-02'	'5.678900%'
0.56789	'0.56789'	'0.567890'	'5.678900e-01'	'56.789000%'
5.6789	'5.6789'	'5.678900'	'5.678900e+00'	'567.890000%'
56.789	'56.789'	'56.789000'	'5.678900e+01'	'5678.900000%'
567.89	'567.89'	'567.890000'	'5.678900e+02'	'56789.000000%'

	{<float>:.2}	{<float>:.2f}	{<float>:.2e}	{<float>:.2%}
0.000056789	'5.7e-05'	'0.00'	'5.68e-05'	'0.01%'
0.00056789	'0.00057'	'0.00'	'5.68e-04'	'0.06%'
0.0056789	'0.0057'	'0.01'	'5.68e-03'	'0.57%'
0.056789	'0.057'	'0.06'	'5.68e-02'	'5.68%'
0.56789	'0.57'	'0.57'	'5.68e-01'	'56.79%'
5.6789	'5.7'	'5.68'	'5.68e+00'	'567.89%'
56.789	'5.7e+01'	'56.79'	'5.68e+01'	'5678.90%'
567.89	'5.7e+02'	'567.89'	'5.68e+02'	'56789.00%'

Ints

```
{90:c}                                  # 'Z'
{90:b}                                  # '1011010'
{90:X}                                  # '5A'
```

Numbers

Types

```
<int>      = int(<float/str/bool>)       # Or: math.floor(<float>)
<float>    = float(<int/str/bool>)       # Or: <real>e±<int>
<complex>  = complex(real=0, imag=0)     # Or: <real> ± <real>j
<Fraction> = fractions.Fraction(0, 1)    # Or: Fraction(numerator=0, denominator=1)
<Decimal>  = decimal.Decimal(<str/int>)  # Or: Decimal((sign, digits, exponent))
```

- **`'int(<str>)'` and `'float(<str>)'` raise ValueError on malformed strings.**
- **Decimal numbers can be represented exactly, unlike floats where `'1.1 + 2.2 != 3.3'`.**
- **Precision of decimal operations is set with: `'decimal.getcontext().prec = <int>'`.**

Basic Functions

```
<num> = pow(<num>, <num>)                # Or: <num> ** <num>
<num> = abs(<num>)                       # <float> = abs(<complex>)
<num> = round(<num> [, ±ndigits])        # `round(126, -1) == 130`
```

Math

```
from math import e, pi, inf, nan, isinf, isnan
from math import cos, acos, sin, asin, tan, atan, degrees, radians
from math import log, log10, log2
```

Statistics

```
from statistics import mean, median, variance, stdev, pvariance, pstdev
```

Random

```
from random import random, randint, choice, shuffle
<float> = random()
<int>   = randint(from_inclusive, to_inclusive)
<el>    = choice(<list>)
shuffle(<list>)
```

Bin, Hex

```
<int>        = ±0b<bin>                 # Or: ±0x<hex>
<int>        = int('±<bin>', 2)         # Or: int('±<hex>', 16)
<int>        = int('±0b<bin>', 0)       # Or: int('±0x<hex>', 0)
'[-]0b<bin>' = bin(<int>)               # Or: hex(<int>)
```

Bitwise Operators

```
<int>        = <int> & <int>            # And
<int>        = <int> | <int>            # Or
<int>        = <int> ^ <int>            # Xor (0 if both bits equal)
<int>        = <int> << n_bits          # Shift left (>> for right)
<int>        = ~<int>                   # Not (also: -<int> - 1)
```

Combinatorics

- **Every function returns an iterator.**
- **If you want to print the iterator, you need to pass it to the list() function first!**

```
from itertools import product, combinations, combinations_with_replacement, permutations
```

```
>>> product([0, 1], repeat=3)
[(0, 0, 0), (0, 0, 1), (0, 1, 0), (0, 1, 1),
 (1, 0, 0), (1, 0, 1), (1, 1, 0), (1, 1, 1)]
```

```
>>> product('ab', '12')
[('a', '1'), ('a', '2'),
 ('b', '1'), ('b', '2')]
```

```
>>> combinations('abc', 2)
[('a', 'b'), ('a', 'c'),
 ('b', 'c')]
```

```
>>> combinations_with_replacement('abc', 2)
[('a', 'a'), ('a', 'b'), ('a', 'c'),
 ('b', 'b'), ('b', 'c'),
 ('c', 'c')]
```

```
>>> permutations('abc', 2)
[('a', 'b'), ('a', 'c'),
 ('b', 'a'), ('b', 'c'),
 ('c', 'a'), ('c', 'b')]
```

Datetime

- **Module 'datetime' provides 'date' <D>, 'time' <T>, 'datetime' <DT> and 'timedelta' <TD> classes. All are immutable and hashable.**
- **Time and datetime objects can be 'aware' <a>, meaning they have defined timezone, or 'naive' <n>, meaning they don't.**
- **If object is naive, it is presumed to be in the system's timezone.**

```
from datetime import date, time, datetime, timedelta
from dateutil.tz import UTC, tzlocal, gettz, resolve_imaginary
```

Constructors

```
<D>  = date(year, month, day)
<T>  = time(hour=0, minute=0, second=0, microsecond=0, tzinfo=None, fold=0)
<DT> = datetime(year, month, day, hour=0, minute=0, second=0, ...)
<TD> = timedelta(days=0, seconds=0, microseconds=0, milliseconds=0,
                 minutes=0, hours=0, weeks=0)
```

- **Use `'<D/DT>.weekday()'` to get the day of the week (Mon == 0).**
- **`'fold=1'` means the second pass in case of time jumping back for one hour.**
- **`'<DTa> = resolve_imaginary(<DTa>)'` fixes DTs that fall into the missing hour.**

Now

```
<D/DTn>  = D/DT.today()                  # Current local date or naive datetime.
<DTn>    = DT.utcnow()                   # Naive datetime from current UTC time.
<DTa>    = DT.now(<tzinfo>)              # Aware datetime from current tz time.
```

- **To extract time use `'<DTn>.time()'`, `'<DTa>.time()'` or `'<DTa>.timetz()'`.**

Timezone

```
<tzinfo> = UTC                           # UTC timezone. London without DST.
<tzinfo> = tzlocal()                     # Local timezone. Also gettz().
<tzinfo> = gettz('<Continent>/<City>')   # 'Continent/City_Name' timezone or None.
<DTa>    = <DT>.astimezone(<tzinfo>)     # Datetime, converted to passed timezone.
<Ta/DTa> = <T/DT>.replace(tzinfo=<tzinfo>)  # Unconverted object with new timezone.
```

Encode

```
<D/T/DT> = D/T/DT.fromisoformat('<iso>')    # Object from ISO string. Raises ValueError.
<DT>     = DT.strptime(<str>, '<format>')   # Datetime from str, according to format.
<D/DTn>  = D/DT.fromordinal(<int>)          # D/DTn from days since Christ, at midnight.
<DTn>    = DT.fromtimestamp(<real>)         # Local time DTn from seconds since Epoch.
<DTa>    = DT.fromtimestamp(<real>, <tz.>)  # Aware datetime from seconds since Epoch.
```

- **ISO strings come in following forms: `'YYYY-MM-DD'`, `'HH:MM:SS.ffffff[±<offset>]'`, or both separated by an arbitrary character. Offset is formatted as: `'HH:MM'`.**
- **Epoch on Unix systems is: `'1970-01-01 00:00 UTC'`, `'1970-01-01 01:00 CET'`, ...**

Decode

```
<str>    = <D/T/DT>.isoformat(sep='T')      # Also timespec='auto/hours/minutes/seconds'.
<str>    = <D/T/DT>.strftime('<format>')    # Custom string representation.
<int>    = <D/DT>.toordinal()               # Days since Christ, ignoring time and tz.
<float>  = <DTn>.timestamp()                # Seconds since Epoch, from DTn in local tz.
<float>  = <DTa>.timestamp()                # Seconds since Epoch, from DTa.
```

Format

```
>>> from datetime import datetime
>>> dt = datetime.strptime('2015-05-14 23:39:00.00 +0200', '%Y-%m-%d %H:%M:%S.%f %z')
>>> dt.strftime("%A, %dth of %B '%y, %I:%M%p %Z")
"Thursday, 14th of May '15, 11:39PM UTC+02:00"
```

- **When parsing, `'%z'` also accepts `'±HH:MM'`.**
- **For abbreviated weekday and month use `'%a'` and `'%b'`.**

Arithmetics

```
<D/DT>   = <D/DT>   ± <TD>                  # Returned datetime can fall into missing hour.
<TD>     = <D/DTn>  - <D/DTn>               # Returns the difference, ignoring time jumps.
<TD>     = <DTa>    - <DTa>                 # Ignores time jumps if they share tzinfo object.
<TD>     = <DT_UTC> - <DT_UTC>              # Convert DTs to UTC to get the actual delta.
```

Arguments

Inside Function Call

```
<function>(<positional_args>)                    # f(0, 0)
<function>(<keyword_args>)                       # f(x=0, y=0)
<function>(<positional_args>, <keyword_args>)    # f(0, y=0)
```

Inside Function Definition

```
def f(<nondefault_args>):                        # def f(x, y):
def f(<default_args>):                           # def f(x=0, y=0):
def f(<nondefault_args>, <default_args>):        # def f(x, y=0):
```

Splat Operator

Inside Function Call

Splat expands a collection into positional arguments, while splatty-splat expands a dictionary into keyword arguments.

```
args   = (1, 2)
kwargs = {'x': 3, 'y': 4, 'z': 5}
func(*args, **kwargs)
```

Is the same as:

```
func(1, 2, x=3, y=4, z=5)
```

Inside Function Definition

Splat combines zero or more positional arguments into a tuple, while splatty-splat combines zero or more keyword arguments into a dictionary.

```
def add(*a):
    return sum(a)
```

```
>>> add(1, 2, 3)
6
```

Legal argument combinations:

```
def f(x, y, z):               # f(x=1, y=2, z=3) | f(1, y=2, z=3) | f(1, 2, z=3) | f(1, 2, 3)
def f(*, x, y, z):            # f(x=1, y=2, z=3)
def f(x, *, y, z):            # f(x=1, y=2, z=3) | f(1, y=2, z=3)
def f(x, y, *, z):            # f(x=1, y=2, z=3) | f(1, y=2, z=3) | f(1, 2, z=3)
```

```
def f(*args):                 # f(1, 2, 3)
def f(x, *args):              # f(1, 2, 3)
def f(*args, z):              # f(1, 2, z=3)
def f(x, *args, z):           # f(1, 2, z=3)
```

```
def f(**kwargs):              # f(x=1, y=2, z=3)
def f(x, **kwargs):           # f(x=1, y=2, z=3) | f(1, y=2, z=3)
def f(*, x, **kwargs):        # f(x=1, y=2, z=3)
```

```
def f(*args, **kwargs):       # f(x=1, y=2, z=3) | f(1, y=2, z=3) | f(1, 2, z=3) | f(1, 2, 3)
def f(x, *args, **kwargs):    # f(x=1, y=2, z=3) | f(1, y=2, z=3) | f(1, 2, z=3) | f(1, 2, 3)
def f(*args, y, **kwargs):    # f(x=1, y=2, z=3) | f(1, y=2, z=3)
def f(x, *args, z, **kwargs): # f(x=1, y=2, z=3) | f(1, y=2, z=3) | f(1, 2, z=3)
```

Other Uses

```
<list>  = [*<collection> [, ...]]
<set>   = {*<collection> [, ...]}
<tuple> = (*<collection>, [...])
<dict>  = {**<dict> [, ...]}
```

```
head, *body, tail = <collection>
```

Inline

Lambda

```
<function> = lambda: <return_value>
<function> = lambda <argument_1>, <argument_2>: <return_value>
```

Comprehension

```
<list> = [i+1 for i in range(10)]                   # [1, 2, ..., 10]
<set>  = {i for i in range(10) if i > 5}            # {6, 7, 8, 9}
<iter> = (i+5 for i in range(10))                   # (5, 6, ..., 14)
<dict> = {i: i*2 for i in range(10)}                # {0: 0, 1: 2, ..., 9: 18}
```

```
out = [i+j for i in range(10) for j in range(10)]
```

Is the same as:

```
out = []
for i in range(10):
    for j in range(10):
        out.append(i+j)
```

Map, Filter, Reduce

```
from functools import reduce
<iter> = map(lambda x: x + 1, range(10))            # (1, 2, ..., 10)
<iter> = filter(lambda x: x > 5, range(10))         # (6, 7, 8, 9)
<obj>  = reduce(lambda out, x: out + x, range(10))  # 45
```

Any, All

```
<bool> = any(<collection>)                          # False if empty.
<bool> = all(el[1] for el in <collection>)          # True if empty.
```

If - Else

```
<obj> = <expression_if_true> if <condition> else <expression_if_false>
```

```
>>> [a if a else 'zero' for a in (0, 1, 2, 3)]
['zero', 1, 2, 3]
```

Namedtuple, Enum, Dataclass

```
from collections import namedtuple
Point     = namedtuple('Point', 'x y')
point     = Point(0, 0)
```

```
from enum import Enum
Direction = Enum('Direction', 'n e s w')
direction = Direction.n
```

```
from dataclasses import make_dataclass
Creature  = make_dataclass('Creature', ['location', 'direction'])
creature  = Creature(Point(0, 0), Direction.n)
```

Closure

We have a closure in Python when:

- **A nested function references a value of its enclosing function and then**
- **the enclosing function returns the nested function.**

```
def get_multiplier(a):
    def out(b):
        return a * b
    return out
```

```
>>> multiply_by_3 = get_multiplier(3)
>>> multiply_by_3(10)
30
```

- **If multiple nested functions within enclosing function reference the same value, that value gets shared.**
- **To dynamically access function's first free variable use `'<function>.__closure__[0].cell_contents'`.**

Partial

```
from functools import partial
<function> = partial(<function> [, <arg_1>, <arg_2>, ...])
```

```
>>> import operator as op
>>> multiply_by_3 = partial(op.mul, 3)
>>> multiply_by_3(10)
30
```

- **Partial is also useful in cases when function needs to be passed as an argument, because it enables us to set its arguments beforehand.**

- A few examples being: `'defaultdict(<function>)'`, `'iter(<function>, to_exclusive)'` and dataclass's `'field(default_factory=<function>)'`.

Non-Local

If variable is being assigned to anywhere in the scope, it is regarded as a local variable, unless it is declared as a 'global' or a 'nonlocal'.

```
def get_counter():
    i = 0
    def out():
        nonlocal i
        i += 1
        return i
    return out
```

```
>>> counter = get_counter()
>>> counter(), counter(), counter()
(1, 2, 3)
```

Decorator

A decorator takes a function, adds some functionality and returns it.

```
@decorator_name
def function_that_gets_passed_to_decorator():
    ...
```

Debugger Example

Decorator that prints function's name every time it gets called.

```
from functools import wraps

def debug(func):
    @wraps(func)
    def out(*args, **kwargs):
        print(func.__name__)
        return func(*args, **kwargs)
    return out

@debug
def add(x, y):
    return x + y
```

- Wraps is a helper decorator that copies the metadata of the passed function (func) to the function it is wrapping (out).
- Without it `'add.__name__'` would return `'out'`.

LRU Cache

Decorator that caches function's return values. All function's arguments must be hashable.

```
from functools import lru_cache

@lru_cache(maxsize=None)
def fib(n):
    return n if n < 2 else fib(n-2) + fib(n-1)
```

- CPython interpreter limits recursion depth to 1000 by default. To increase it use `'sys.setrecursionlimit(<depth>)'`.

Parametrized Decorator

A decorator that accepts arguments and returns a normal decorator that accepts a function.

```
from functools import wraps

def debug(print_result=False):
    def decorator(func):
        @wraps(func)
        def out(*args, **kwargs):
            result = func(*args, **kwargs)
            print(func.__name__, result if print_result else '')
            return result
        return out
    return decorator

@debug(print_result=True)
def add(x, y):
    return x + y
```

Class

```
class <name>:
    def __init__(self, a):
        self.a = a
    def __repr__(self):
        class_name = self.__class__.__name__
        return f'{class_name}({self.a!r})'
    def __str__(self):
        return str(self.a)

    @classmethod
    def get_class_name(cls):
        return cls.__name__
```

- **Return value of repr() should be unambiguous and of str() readable.**
- **If only repr() is defined, it will also be used for str().**

Str() use cases:

```
print(<el>)
print(f'{<el>}')
raise Exception(<el>)
loguru.logger.debug(<el>)
csv.writer(<file>).writerow([<el>])
```

Repr() use cases:

```
print([<el>])
print(f'{<el>!r}')
>>> <el>
loguru.logger.exception()
Z = dataclasses.make_dataclass('Z', ['a']); print(Z(<el>))
```

Constructor Overloading

```
class <name>:
    def __init__(self, a=None):
        self.a = a
```

Inheritance

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

class Employee(Person):
    def __init__(self, name, age, staff_num):
        super().__init__(name, age)
        self.staff_num = staff_num
```

Multiple Inheritance

```
class A: pass
class B: pass
class C(A, B): pass
```

MRO determines the order in which parent classes are traversed when searching for a method:

```
>>> C.mro()
[<class 'C'>, <class 'A'>, <class 'B'>, <class 'object'>]
```

Property

Pythonic way of implementing getters and setters.

```
class MyClass:
    @property
    def a(self):
        return self._a

    @a.setter
    def a(self, value):
        self._a = value
```

```
>>> el = MyClass()
>>> el.a = 123
>>> el.a
123
```

Dataclass

Decorator that automatically generates init(), repr() and eq() special methods.

```
from dataclasses import dataclass, field

@dataclass(order=False, frozen=False)
class <class_name>:
    <attr_name_1>: <type>
    <attr_name_2>: <type> = <default_value>
    <attr_name_3>: list/dict/set = field(default_factory=list/dict/set)
```

- **Objects can be made sortable with `'order=True'` and/or immutable and hashable with `'frozen=True'`.**
- **Function field() is needed because `'<attr_name>: list = []'` would make a list that is shared among all instances.**

- **Default_factory can be any callable.**

Inline:

```
from dataclasses import make_dataclass
<class> = make_dataclass('<class_name>', <coll_of_attribute_names>)
<class> = make_dataclass('<class_name>', <coll_of_tuples>)
<tuple> = ('<attr_name>', <type> [, <default_value>])
```

Slots

Mechanism that restricts objects to attributes listed in 'slots' and significantly reduces their memory footprint.

```
class MyClassWithSlots:
    __slots__ = ['a']
    def __init__(self):
        self.a = 1
```

Copy

```
from copy import copy, deepcopy
<object> = copy(<object>)
<object> = deepcopy(<object>)
```

Duck Types

A duck type is an implicit type that prescribes a set of special methods. Any object that has those methods defined is considered a member of that duck type.

Comparable

- **If eq() method is not overridden, it returns `'id(self) == id(other)'`, which is the same as `'self is other'`.**
- **That means all objects compare not equal by default.**
- **Only the left side object has eq() method called, unless it returns NotImplemented, in which case the right object is consulted.**

```
class MyComparable:
    def __init__(self, a):
        self.a = a
    def __eq__(self, other):
        if isinstance(other, type(self)):
            return self.a == other.a
        return NotImplemented
```

Hashable

- **Hashable object needs both hash() and eq() methods and its hash value should never change.**
- **Hashable objects that compare equal must have the same hash value, meaning default hash() that returns `'id(self)'` will not do.**
- **That is why Python automatically makes classes unhashable if you only implement eq().**

```
class MyHashable:
    def __init__(self, a):
        self._a = a
    @property
    def a(self):
        return self._a
    def __eq__(self, other):
        if isinstance(other, type(self)):
            return self.a == other.a
        return NotImplemented
    def __hash__(self):
        return hash(self.a)
```

Sortable

- **With total_ordering decorator, you only need to provide eq() and one of lt(), gt(), le() or ge() special methods.**

```
from functools import total_ordering

@total_ordering
class MySortable:
    def __init__(self, a):
        self.a = a
    def __eq__(self, other):
        if isinstance(other, type(self)):
            return self.a == other.a
        return NotImplemented
    def __lt__(self, other):
        if isinstance(other, type(self)):
            return self.a < other.a
        return NotImplemented
```

Iterator

- **Any object that has methods next() and iter() is an iterator.**
- **Next() should return next item or raise StopIteration.**
- **Iter() should return 'self'.**

```
class Counter:
    def __init__(self):
        self.i = 0
    def __next__(self):
        self.i += 1
        return self.i
    def __iter__(self):
        return self
```

```
>>> counter = Counter()
>>> next(counter), next(counter), next(counter)
(1, 2, 3)
```

Python has many different iterator objects:

- **Iterators returned by the iter() function, such as list_iterator and set_iterator.**
- **Objects returned by the itertools module, such as count, repeat and cycle.**
- **Generators returned by the generator functions and generator expressions.**
- **File objects returned by the open() function, etc.**

Callable

- **All functions and classes have a call() method, hence are callable.**
- **When this cheatsheet uses `'<function>'` as an argument, it actually means `'<callable>'`.**

```
class Counter:
    def __init__(self):
        self.i = 0
    def __call__(self):
        self.i += 1
        return self.i
```

```
>>> counter = Counter()
>>> counter(), counter(), counter()
(1, 2, 3)
```

Context Manager

- **Enter() should lock the resources and optionally return an object.**
- **Exit() should release the resources.**
- **Any exception that happens inside the with block is passed to the exit() method.**
- **If it wishes to suppress the exception it must return a true value.**

```
class MyOpen:
    def __init__(self, filename):
        self.filename = filename
    def __enter__(self):
        self.file = open(self.filename)
        return self.file
    def __exit__(self, exc_type, exception, traceback):
        self.file.close()
```

```
>>> with open('test.txt', 'w') as file:
...     file.write('Hello World!')
>>> with MyOpen('test.txt') as file:
...     print(file.read())
Hello World!
```

Iterable Duck Types

Iterable

- **Only required method is iter(). It should return an iterator of object's items.**
- **Contains() automatically works on any object that has iter() defined.**

```
class MyIterable:
    def __init__(self, a):
        self.a = a
    def __iter__(self):
        return iter(self.a)
    def __contains__(self, el):
        return el in self.a
```

```
>>> obj = MyIterable([1, 2, 3])
>>> [el for el in obj]
[1, 2, 3]
>>> 1 in obj
True
```

Collection

- Only required methods are iter() and len().
- This cheatsheet actually means `'<iterable>'` when it uses `'<collection>'`.
- I chose not to use the name 'iterable' because it sounds scarier and more vague than 'collection'.

```
class MyCollection:
    def __init__(self, a):
        self.a = a
    def __iter__(self):
        return iter(self.a)
    def __contains__(self, el):
        return el in self.a
    def __len__(self):
        return len(self.a)
```

Sequence

- **Only required methods are len() and getitem().**
- **Getitem() should return an item at index or raise IndexError.**
- **Iter() and contains() automatically work on any object that has getitem() defined.**
- **Reversed() automatically works on any object that has getitem() and len() defined.**

```
class MySequence:
    def __init__(self, a):
        self.a = a
    def __iter__(self):
        return iter(self.a)
    def __contains__(self, el):
        return el in self.a
    def __len__(self):
        return len(self.a)
    def __getitem__(self, i):
        return self.a[i]
    def __reversed__(self):
        return reversed(self.a)
```

ABC Sequence

- **It's a richer interface than the basic sequence.**
- **Extending it generates iter(), contains(), reversed(), index() and count().**
- **Unlike `'abc.Iterable'` and `'abc.Collection'`, it is not a duck type. That is why `'issubclass(MySequence, abc.Sequence)'` would return False even if MySequence had all the methods defined.**

```
from collections import abc

class MyAbcSequence(abc.Sequence):
    def __init__(self, a):
        self.a = a
    def __len__(self):
        return len(self.a)
    def __getitem__(self, i):
        return self.a[i]
```

Table of required and automatically available special methods:

	Iterable	Collection	Sequence	abc.Sequence
iter()	!	!	✓	✓
contains()	✓	✓	✓	✓
len()		!	!	!
getitem()			!	!
reversed()			✓	✓
index()				✓
count()				✓

- **Other ABCs that generate missing methods are: MutableSequence, Set, MutableSet, Mapping and MutableMapping.**
- **Names of their required methods are stored in `'<abc>.__abstractmethods__'`.**

Enum

```
from enum import Enum, auto

class <enum_name>(Enum):
    <member_name_1> = <value_1>
    <member_name_2> = <value_2_a>, <value_2_b>
    <member_name_3> = auto()
```

- **If there are no numeric values before auto(), it returns 1.**
- **Otherwise it returns an increment of the last numeric value.**

```
<member> = <enum>.<member_name>                # Returns a member.
<member> = <enum>['<member_name>']             # Returns a member or raises KeyError.
<member> = <enum>(<value>)                     # Returns a member or raises ValueError.
<str>    = <member>.name                       # Returns member's name.
<obj>    = <member>.value                      # Returns member's value.
```

```
list_of_members = list(<enum>)
member_names    = [a.name for a in <enum>]
member_values   = [a.value for a in <enum>]
random_member   = random.choice(list(<enum>))
```

```
def get_next_member(member):
    members = list(member.__class__)
    index   = (members.index(member) + 1) % len(members)
    return members[index]
```

Inline

```
Cutlery = Enum('Cutlery', 'fork knife spoon')
Cutlery = Enum('Cutlery', ['fork', 'knife', 'spoon'])
Cutlery = Enum('Cutlery', {'fork': 1, 'knife': 2, 'spoon': 3})
```

User-defined functions cannot be values, so they must be wrapped:

```
from functools import partial
LogicOp = Enum('LogicOp', {'AND': partial(lambda l, r: l and r),
                           'OR' : partial(lambda l, r: l or r)})
```

- Another solution in this particular case is to use built-in functions and_() and or_() from the module operator.

Exceptions

Basic Example

```
try:
    <code>
except <exception>:
    <code>
```

Complex Example

```
try:
    <code_1>
except <exception_a>:
    <code_2_a>
except <exception_b>:
    <code_2_b>
else:
    <code_2_c>
finally:
    <code_3>
```

- Code inside the `'else'` block will only be executed if `'try'` block had no exception.

- Code inside the `'finally'` block will always be executed.

Catching Exceptions

```
except <exception>:
except <exception> as <name>:
except (<exception>, ...):
except (<exception>, ...) as <name>:
```

- Also catches subclasses of the exception.
- Use `'traceback.print_exc()'` to print the error message to stderr.

Raising Exceptions

```
raise <exception>
raise <exception>()
raise <exception>(<el> [, ...])
```

Re-raising caught exception:

```
except <exception> as <name>:
    ...
    raise
```

Exception Object

```
arguments = <name>.args
exc_type  = <name>.__class__
filename  = <name>.__traceback__.tb_frame.f_code.co_filename
func_name = <name>.__traceback__.tb_frame.f_code.co_name
line      = linecache.getline(filename, <name>.__traceback__.tb_lineno)
error_msg = traceback.format_exception(exc_type, <name>, <name>.__traceback__)
```

Built-in Exceptions

```
BaseException
 ├── SystemExit                   # Raised by the sys.exit() function.
 ├── KeyboardInterrupt            # Raised when the user hits the interrupt key (ctrl-c).
 └── Exception                    # User-defined exceptions should be derived from this class.
      ├── ArithmeticError         # Base class for arithmetic errors.
      │    └── ZeroDivisionError  # Raised when dividing by zero.
      ├── AttributeError          # Raised when an attribute is missing.
      ├── EOFError                # Raised by input() when it hits end-of-file condition.
      ├── LookupError             # Raised when a look-up on a collection fails.
      │    ├── IndexError         # Raised when a sequence index is out of range.
      │    └── KeyError           # Raised when a dictionary key or set element is not found.
      ├── NameError               # Raised when a variable name is not found.
      ├── OSError                 # Failures such as “file not found” or “disk full”.
      │    └── FileNotFoundError  # When a file or directory is requested but doesn't exist.
      ├── RuntimeError            # Raised by errors that don't fall in other categories.
      │    └── RecursionError     # Raised when the maximum recursion depth is exceeded.
      ├── StopIteration           # Raised by next() when run on an empty iterator.
      ├── TypeError               # Raised when an argument is of wrong type.
      └── ValueError              # When an argument is of right type but inappropriate value.
           └── UnicodeError       # Raised when encoding/decoding strings to/from bytes fails.
```

Collections and their exceptions:

	list	dict	set
getitem()	IndexError	KeyError	
pop()	IndexError	KeyError	KeyError
remove()	ValueError		KeyError
index()	ValueError		

Useful built-in exceptions:

```
raise TypeError('Argument is of wrong type!')
raise ValueError('Argument is of right type but inappropriate value!')
raise RuntimeError('None of above!')
```

User-defined Exceptions

```
class MyError(Exception):
    pass

class MyInputError(MyError):
    pass
```

Exit

Exits the interpreter by raising SystemExit exception.

```
import sys
sys.exit()                      # Exits with exit code 0 (success).
sys.exit(<el>)                  # Prints to stderr and exits with 1.
sys.exit(<int>)                 # Exits with passed exit code.
```

Print

```
print(<el_1>, ..., sep=' ', end='\n', file=sys.stdout, flush=False)
```

- Use `'file=sys.stderr'` for messages about errors.
- Use `'flush=True'` to forcibly flush the stream.

Pretty Print

```
from pprint import pprint
pprint(<collection>, width=80, depth=None, compact=False, sort_dicts=True)
```

- Levels deeper than 'depth' get replaced by '...'.

Input

Reads a line from user input or pipe if present.

```
<str> = input(prompt=None)
```

- Trailing newline gets stripped.
- Prompt string is printed to the standard output before reading input.
- Raises EOFError when user hits EOF (ctrl-d/z) or input stream gets exhausted.

Command Line Arguments

```
import sys
script_name = sys.argv[0]
arguments   = sys.argv[1:]
```

Argument Parser

```
from argparse import ArgumentParser, FileType
p = ArgumentParser(description=<str>)
p.add_argument('-<short_name>', '--<name>', action='store_true')  # Flag
p.add_argument('-<short_name>', '--<name>', type=<type>)          # Option
p.add_argument('<name>', type=<type>, nargs=1)                    # First argument
p.add_argument('<name>', type=<type>, nargs='+')                  # Remaining arguments
p.add_argument('<name>', type=<type>, nargs='*')                  # Optional arguments
args  = p.parse_args()                                            # Exits on error.
value = args.<name>
```

- **Use `'help=<str>'` to set argument description.**
- **Use `'default=<el>'` to set the default value.**
- **Use `'type=FileType(<mode>)'` for files.**

Open

Opens the file and returns a corresponding file object.

```
<file> = open('<path>', mode='r', encoding=None, newline=None)
```

- **`'encoding=None'` means that the default encoding is used, which is platform dependent. Best practice is to use `'encoding="utf-8"'` whenever possible.**

- `'newline=None'` means all different end of line combinations are converted to '\n' on read, while on write all '\n' characters are converted to system's default line separator.
- `'newline=""'` means no conversions take place, but input is still broken into chunks by readline() and readlines() on either '\n', '\r' or '\r\n'.

Modes

- `'r'` - Read (default).
- `'w'` - Write (truncate).
- `'x'` - Write or fail if the file already exists.
- `'a'` - Append.
- `'w+'` - Read and write (truncate).
- `'r+'` - Read and write from the start.
- `'a+'` - Read and write from the end.
- `'t'` - Text mode (default).
- `'b'` - Binary mode.

Exceptions

- `'FileNotFoundError'` can be raised when reading with `'r'` or `'r+'`.
- `'FileExistsError'` can be raised when writing with `'x'`.
- `'IsADirectoryError'` and `'PermissionError'` can be raised by any.
- `'OSError'` is the parent class of all listed exceptions.

File Object

```
<file>.seek(0)                      # Moves to the start of the file.
<file>.seek(offset)                 # Moves 'offset' chars/bytes from the start.
<file>.seek(0, 2)                   # Moves to the end of the file.
<bin_file>.seek(±offset, <anchor>)  # Anchor: 0 start, 1 current position, 2 end.
```

```
<str/bytes> = <file>.read(size=-1)  # Reads 'size' chars/bytes or until EOF.
<str/bytes> = <file>.readline()     # Returns a line or empty string/bytes on EOF.
<list>      = <file>.readlines()    # Returns a list of remaining lines.
<str/bytes> = next(<file>)          # Returns a line using buffer. Do not mix.
```

```
<file>.write(<str/bytes>)           # Writes a string or bytes object.
<file>.writelines(<collection>)     # Writes a coll. of strings or bytes objects.
<file>.flush()                      # Flushes write buffer.
```

- **Methods do not add or strip trailing newlines, even writelines().**

Read Text from File

```
def read_file(filename):
    with open(filename, encoding='utf-8') as file:
        return file.readlines()
```

Write Text to File

```
def write_to_file(filename, text):
    with open(filename, 'w', encoding='utf-8') as file:
        file.write(text)
```

Path

```
from os import getcwd, path, listdir
from glob import glob
```

```
<str>  = getcwd()                   # Returns the current working directory.
<str>  = path.join(<path>, ...)     # Joins two or more pathname components.
<str>  = path.abspath(<path>)       # Returns absolute path.
```

```
<str>  = path.basename(<path>)      # Returns final component of the path.
<str>  = path.dirname(<path>)       # Returns path without the final component.
<tup.> = path.splitext(<path>)      # Splits on last period of the final component.
```

```
<list> = listdir(path='.')          # Returns filenames located at path.
<list> = glob('<pattern>')          # Returns paths matching the wildcard pattern.
```

```
<bool> = path.exists(<path>)        # Or: <Path>.exists()
<bool> = path.isfile(<path>)        # Or: <DirEntry/Path>.is_file()
<bool> = path.isdir(<path>)         # Or: <DirEntry/Path>.is_dir()
```

DirEntry

Using scandir() instead of listdir() can significantly increase the performance of code that also needs file type information.

```
from os import scandir
```

```
<iter> = scandir(path='.')          # Returns DirEntry objects located at path.
<str>  = <DirEntry>.path            # Returns path as a string.
<str>  = <DirEntry>.name            # Returns final component as a string.
<file> = open(<DirEntry>)           # Opens the file and returns file object.
```

Path Object

```
from pathlib import Path
```

```
<Path> = Path(<path> [, ...])       # Accepts strings, Paths and DirEntry objects.
<Path> = <path> / <path> [/ ...]    # One of the paths must be a Path object.
```

```
<Path> = Path()                     # Returns relative cwd. Also Path('.').
<Path> = Path.cwd()                 # Returns absolute cwd. Also Path().resolve().
<Path> = <Path>.resolve()           # Returns absolute Path without symlinks.
```

```
<Path> = <Path>.parent              # Returns Path without final component.
<str>  = <Path>.name                # Returns final component as a string.
<str>  = <Path>.stem                # Returns final component without extension.
<str>  = <Path>.suffix              # Returns final component's extension.
<tup.> = <Path>.parts               # Returns all components as strings.
```

```
<iter> = <Path>.iterdir()           # Returns dir contents as Path objects.
<iter> = <Path>.glob('<pattern>')   # Returns Paths matching the wildcard pattern.
```

```
<str>  = str(<Path>)                # Returns path as a string.
<file> = open(<Path>)               # Opens the file and returns file object.
```

OS Commands

Files and Directories

- **Paths can be either strings, Paths or DirEntry objects.**
- **Functions report OS related errors by raising either OSError or one of its subclasses.**

```
import os, shutil
```

```
os.chdir(<path>)                    # Changes the current working directory.
os.mkdir(<path>, mode=0o777)        # Creates a directory. Mode is in octal.
```

```
shutil.copy(from, to)               # Copies the file. 'to' can exist or be a dir.
shutil.copytree(from, to)           # Copies the directory. 'to' must not exist.
```

```
os.rename(from, to)                 # Renames/moves the file or directory.
os.replace(from, to)                # Same, but overwrites 'to' if it exists.
```

```
os.remove(<path>)                   # Deletes the file.
os.rmdir(<path>)                    # Deletes the empty directory.
shutil.rmtree(<path>)               # Deletes the directory.
```

Shell Commands

```
import os
<str> = os.popen('<shell_command>').read()
```

Sends '1 + 1' to the basic calculator and captures its output:

```
>>> from subprocess import run
>>> run('bc', input='1 + 1\n', capture_output=True, encoding='utf-8')
CompletedProcess(args='bc', returncode=0, stdout='2\n', stderr='')
```

Sends test.in to the basic calculator running in standard mode and saves its output to test.out:

```
>>> from shlex import split
>>> os.popen('echo 1 + 1 > test.in')
>>> run(split('bc -s'), stdin=open('test.in'), stdout=open('test.out', 'w'))
CompletedProcess(args=['bc', '-s'], returncode=0)
>>> open('test.out').read()
'2\n'
```

JSON

Text file format for storing collections of strings and numbers.

```
import json
<str>    = json.dumps(<object>, ensure_ascii=True, indent=None)
<object> = json.loads(<str>)
```

Read Object from JSON File

```
def read_json_file(filename):
    with open(filename, encoding='utf-8') as file:
        return json.load(file)
```

Write Object to JSON File

```
def write_to_json_file(filename, an_object):
    with open(filename, 'w', encoding='utf-8') as file:
        json.dump(an_object, file, ensure_ascii=False, indent=2)
```

Pickle

Binary file format for storing objects.

```
import pickle
<bytes>  = pickle.dumps(<object>)
<object> = pickle.loads(<bytes>)
```

Read Object from File

```
def read_pickle_file(filename):
    with open(filename, 'rb') as file:
        return pickle.load(file)
```

Write Object to File

```
def write_to_pickle_file(filename, an_object):
    with open(filename, 'wb') as file:
        pickle.dump(an_object, file)
```

CSV

Text file format for storing spreadsheets.

```
import csv
```

Read

```
<reader> = csv.reader(<file>)       # Also: `dialect='excel', delimiter=',`.
<list>   = next(<reader>)           # Returns next row as a list of strings.
<list>   = list(<reader>)           # Returns list of remaining rows.
```

- **File must be opened with `'newline=""'` argument, or newlines embedded inside quoted fields will not be interpreted correctly!**

Write

```
<writer> = csv.writer(<file>)       # Also: `dialect='excel', delimiter=',`.
<writer>.writerow(<collection>)     # Encodes objects using `str(<el>)`.
<writer>.writerows(<coll_of_coll>)  # Appends multiple rows.
```

- **File must be opened with `'newline=""'` argument, or '\r' will be added in front of every '\n' on platforms that use '\r\n' line endings!**

Parameters

- `'dialect'` - Master parameter that sets the default values.
- `'delimiter'` - A one-character string used to separate fields.
- `'quotechar'` - Character for quoting fields that contain special characters.
- `'doublequote'` - Whether quotechars inside fields get doubled or escaped.
- `'skipinitialspace'` - Whether whitespace after delimiter gets stripped.
- `'lineterminator'` - Specifies how writer terminates rows.
- `'quoting'` - Controls the amount of quoting: 0 - as necessary, 1 - all.
- `'escapechar'` - Character for escaping 'quotechar' if 'doublequote' is False.

Dialects

	excel	excel-tab	unix
delimiter	','	'\t'	','
quotechar	'"'	'"'	'"'
doublequote	True	True	True
skipinitialspace	False	False	False
lineterminator	'\r\n'	'\r\n'	'\n'
quoting	0	0	1
escapechar	None	None	None

Read Rows from CSV File

```
def read_csv_file(filename):
    with open(filename, encoding='utf-8', newline='') as file:
        return list(csv.reader(file))
```

Write Rows to CSV File

```
def write_to_csv_file(filename, rows):
    with open(filename, 'w', encoding='utf-8', newline='') as file:
        writer = csv.writer(file)
        writer.writerows(rows)
```

SQLite

Server-less database engine that stores each database into a separate file.

Connect

Opens a connection to the database file. Creates a new file if path doesn't exist.

```
import sqlite3
<con> = sqlite3.connect('<path>')             # Also ':memory:'.
<con>.close()
```

Read

Returned values can be of type str, int, float, bytes or None.

```
<cursor> = <con>.execute('<query>')           # Can raise a subclass of sqlite3.Error.
<tuple>  = <cursor>.fetchone()                # Returns next row. Also next(<cursor>).
<list>   = <cursor>.fetchall()                # Returns remaining rows. Also list(<cursor>).
```

Write

```
<con>.execute('<query>')
<con>.commit()
```

Or:

```
with <con>:
    <con>.execute('<query>')
```

Placeholders

- **Passed values can be of type str, int, float, bytes, None, bool, datetime.date or datetime.datetme.**
- **Bools will be stored and returned as ints and dates as ISO formatted strings.**

```
<con>.execute('<query>', <list/tuple>)          # Replaces '?'s in query with values.
<con>.execute('<query>', <dict/namedtuple>)     # Replaces ':<key>'s with values.
<con>.executemany('<query>', <coll_of_above>)   # Runs execute() many times.
```

Example

In this example values are not actually saved because `'con.commit()'` is omitted!

```
>>> con = sqlite3.connect('test.db')
>>> con.execute('create table person (person_id integer primary key, name, height)')
>>> con.execute('insert into person values (null, ?, ?)', ('Jean-Luc', 187)).lastrowid
1
>>> con.execute('select * from person').fetchall()
[(1, 'Jean-Luc', 187)]
```

MySQL

Has a very similar interface, with differences listed below.

```
# $ pip3 install mysql-connector
from mysql import connector
<con> = connector.connect(host=<str>, …)        # `user=<str>, password=<str>, database=<str>`.
<cursor> = <con>.cursor()                       # Only cursor has execute method.
<cursor>.execute('<query>')                     # Can raise a subclass of connector.Error.
<cursor>.execute('<query>', <list/tuple>)       # Replaces '%s's in query with values.
<cursor>.execute('<query>', <dict/namedtuple>)  # Replaces '%(<key>)s's with values.
```

Bytes

Bytes object is an immutable sequence of single bytes. Mutable version is called bytearray.

```
<bytes> = b'<str>'                      # Only accepts ASCII characters and \x00 - \xff.
<int>   = <bytes>[<index>]              # Returns int in range from 0 to 255.
<bytes> = <bytes>[<slice>]              # Returns bytes even if it has only one element.
<bytes> = <bytes>.join(<coll_of_bytes>) # Joins elements using bytes object as separator.
```

Encode

```
<bytes> = bytes(<coll_of_ints>)         # Ints must be in range from 0 to 255.
<bytes> = bytes(<str>, 'utf-8')         # Or: <str>.encode('utf-8')
<bytes> = <int>.to_bytes(n_bytes, …)    # `byteorder='big/little', signed=False`.
<bytes> = bytes.fromhex('<hex>')        # Hex numbers can be separated by spaces.
```

Decode

```
<list>  = list(<bytes>)                 # Returns ints in range from 0 to 255.
<str>   = str(<bytes>, 'utf-8')         # Or: <bytes>.decode('utf-8')
<int>   = int.from_bytes(<bytes>, …)    # `byteorder='big/little', signed=False`.
'<hex>' = <bytes>.hex()                 # Returns a string of hexadecimal numbers.
```

Read Bytes from File

```
def read_bytes(filename):
    with open(filename, 'rb') as file:
        return file.read()
```

Write Bytes to File

```
def write_bytes(filename, bytes_obj):
    with open(filename, 'wb') as file:
        file.write(bytes_obj)
```

Struct

- **Module that performs conversions between a sequence of numbers and a bytes object.**
- **Machine's native type sizes and byte order are used by default.**

```
from struct import pack, unpack, iter_unpack
<bytes>  = pack('<format>', <num_1> [, <num_2>, ...])
<tuple>  = unpack('<format>', <bytes>)
<tuples> = iter_unpack('<format>', <bytes>)
```

Example

```
>>> pack('>hhl', 1, 2, 3)
b'\x00\x01\x00\x02\x00\x00\x00\x03'
>>> unpack('>hhl', b'\x00\x01\x00\x02\x00\x00\x00\x03')
(1, 2, 3)
```

Format

For standard type sizes start format string with:

- `'='` - native byte order
- `'<'` - little-endian
- `'>'` - big-endian (also `'!'`)

Integer types. Use a capital letter for unsigned type. Standard sizes are in brackets:

- `'x'` - pad byte
- `'b'` - char (1)
- `'h'` - short (2)
- `'i'` - int (4)
- `'l'` - long (4)
- `'q'` - long long (8)

Floating point types:

- `'f'` - float (4)
- `'d'` - double (8)

Array

List that can only hold numbers of a predefined type. Available types and their sizes in bytes are listed above.

```
from array import array
<array> = array('<typecode>', <collection>)    # Array from collection of numbers.
<array> = array('<typecode>', <bytes>)         # Array from bytes object.
<array> = array('<typecode>', <array>)         # Treats array as a sequence of numbers.
<bytes> = bytes(<array>)                       # Or: <array>.tobytes()
```

Memory View

- **A sequence object that points to the memory of another object.**
- **Each element can reference a single or multiple consecutive bytes, depending on format.**
- **Order and number of elements can be changed with slicing.**

```
<mview> = memoryview(<bytes/bytearray/array>)  # Immutable if bytes, else mutable.
<real>  = <mview>[<index>]                     # Returns an int or a float.
<mview> = <mview>[<slice>]                     # Mview with rearranged elements.
<mview> = <mview>.cast('<typecode>')           # Casts memoryview to the new format.
<mview>.release()                              # Releases the object's memory buffer.
```

Decode

```
<bin_file>.write(<mview>)                      # Writes mview to the binary file.
<bytes> = bytes(<mview>)                       # Creates a new bytes object.
<bytes> = <bytes>.join(<coll_of_mviews>)       # Joins mviews using bytes object as sep.
<array> = array('<typecode>', <mview>)         # Treats mview as a sequence of numbers.
```

```
<list>  = list(<mview>)                 # Returns list of ints or floats.
<str>   = str(<mview>, 'utf-8')         # Treats mview as a bytes object.
<int>   = int.from_bytes(<mview>, …)    # `byteorder='big/little', signed=False`.
'<hex>' = <mview>.hex()                 # Treats mview as a bytes object.
```

Deque

A thread-safe list with efficient appends and pops from either side. Pronounced "deck".

```
from collections import deque
<deque> = deque(<collection>, maxlen=None)
```

```
<deque>.appendleft(<el>)                # Opposite element is dropped if full.
<deque>.extendleft(<collection>)        # Collection gets reversed.
<el> = <deque>.popleft()                # Raises IndexError if empty.
<deque>.rotate(n=1)                     # Rotates elements to the right.
```

Threading

- **CPython interpreter can only run a single thread at a time.**
- **That is why using multiple threads won't result in a faster execution, unless at least one of the threads contains an I/O operation.**

```
from threading import Thread, RLock, Semaphore, Event, Barrier
```

Thread

```
<Thread> = Thread(target=<function>)  # Use `args=<collection>` to set arguments.
<Thread>.start()                      # Starts the thread.
<bool> = <Thread>.is_alive()          # Checks if thread has finished executing.
<Thread>.join()                       # Waits for thread to finish.
```

- **Use `'kwargs=<dict>'` to pass keyword arguments to the function.**
- **Use `'daemon=True'`, or the program will not be able to exit while the thread is alive.**

Lock

```
<lock> = RLock()
<lock>.acquire()                      # Waits for lock to be available.
<lock>.release()                      # Makes the lock available again.
```

Or:

```
lock = RLock()
with lock:
    ...
```

Semaphore, Event, Barrier

```
<Semaphore> = Semaphore(value=1)      # Lock that can be acquired 'value' times.
<Event>     = Event()                 # Method wait() blocks until set() is called.
<Barrier>   = Barrier(n_times)        # Method wait() blocks until it's called 'n_times'.
```

Thread Pool Executor

```
from concurrent.futures import ThreadPoolExecutor
with ThreadPoolExecutor(max_workers=None) as executor:          # Does not exit until done.
    <iter>   = executor.map(lambda x: x + 1, range(3))          # (1, 2, 3)
    <iter>   = executor.map(lambda x, y: x + y, 'abc', '123')  # ('a1', 'b2', 'c3')
    <Future> = executor.submit(<function> [, <arg_1>, ...])    # Also visible outside block.
```

Future:

```
<bool> = <Future>.done()              # Checks if thread has finished executing.
<obj>  = <Future>.result()            # Waits for thread to finish and returns result.
```

Queue

A thread-safe FIFO queue. For LIFO queue use LifoQueue.

```
from queue import Queue
<Queue> = Queue(maxsize=0)
```

```
<Queue>.put(<el>)                     # Blocks until queue stops being full.
<Queue>.put_nowait(<el>)              # Raises queue.Full exception if full.
<el> = <Queue>.get()                  # Blocks until queue stops being empty.
<el> = <Queue>.get_nowait()           # Raises queue.Empty exception if empty.
```

Operator

Module of functions that provide the functionality of operators.

```
from operator import add, sub, mul, truediv, floordiv, mod, pow, neg, abs
from operator import eq, ne, lt, le, gt, ge
from operator import and_, or_, not_
from operator import itemgetter, attrgetter, methodcaller
```

```
import operator as op
elementwise_sum  = map(op.add, list_a, list_b)
sorted_by_second = sorted(<collection>, key=op.itemgetter(1))
sorted_by_both   = sorted(<collection>, key=op.itemgetter(1, 0))
product_of_elems = functools.reduce(op.mul, <collection>)
LogicOp          = enum.Enum('LogicOp', {'AND': op.and_, 'OR' : op.or_})
last_el          = op.methodcaller('pop')(<list>)
```

Introspection

Inspecting code at runtime.

Variables

```
<list> = dir()                          # Names of local variables (incl. functions).
<dict> = vars()                         # Dict of local variables. Also locals().
<dict> = globals()                      # Dict of global variables.
```

Attributes

```
<list> = dir(<object>)                      # Names of object's attributes (incl. methods).
<dict> = vars(<object>)                     # Dict of object's fields. Also <obj>.__dict__.
<bool> = hasattr(<object>, '<attr_name>')   # Checks if getattr() raises an error.
value  = getattr(<object>, '<attr_name>')   # Raises AttributeError if attribute is missing.
setattr(<object>, '<attr_name>', value)     # Only works on objects with __dict__ attribute.
delattr(<object>, '<attr_name>')            # Equivalent to `del <object>.<attr_name>`.
```

Parameters

```
from inspect import signature
<sig>        = signature(<function>)
no_of_params = len(<sig>.parameters)
param_names  = list(<sig>.parameters.keys())
param_kinds  = [a.kind for a in <sig>.parameters.values()]
```

Metaprograming

Code that generates code.

Type

Type is the root class. If only passed an object it returns its type (class). Otherwise it creates a new class.

```
<class> = type('<class_name>', <parents_tuple>, <attributes_dict>)
```

```
>>> Z = type('Z', (), {'a': 'abcde', 'b': 12345})
>>> z = Z()
```

Meta Class

A class that creates classes.

```
def my_meta_class(name, parents, attrs):
    attrs['a'] = 'abcde'
    return type(name, parents, attrs)
```

Or:

```
class MyMetaClass(type):
    def __new__(cls, name, parents, attrs):
        attrs['a'] = 'abcde'
        return type.__new__(cls, name, parents, attrs)
```

- **New() is a class method that gets called before init(). If it returns an instance of its class, then that instance gets passed to init() as a 'self' argument.**
- **It receives the same arguments as init(), except for the first one that specifies the desired type of the returned instance (MyMetaClass in our case).**
- **Like in our case, new() can also be called directly, usually from a new() method of a child class (`def __new__(cls): return super().__new__(cls)`).**
- **The only difference between the examples above is that my_meta_class() returns a class of type type, while MyMetaClass() returns a class of type MyMetaClass.**

Metaclass Attribute

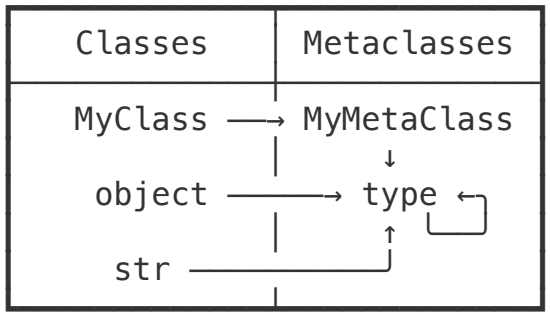
Right before a class is created it checks if it has the 'metaclass' attribute defined. If not, it recursively checks if any of his parents has it defined and eventually comes to type().

```
class MyClass(metaclass=MyMetaClass):
    b = 12345
```

```
>>> MyClass.a, MyClass.b
('abcde', 12345)
```

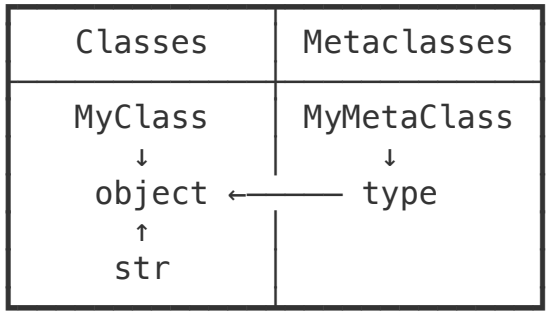
Type Diagram

```
type(MyClass)     == MyMetaClass     # MyClass is an instance of MyMetaClass.
type(MyMetaClass) == type            # MyMetaClass is an instance of type.
```



Inheritance Diagram

```
MyClass.__base__     == object       # MyClass is a subclass of object.
MyMetaClass.__base__ == type         # MyMetaClass is a subclass of type.
```



Eval

```
>>> from ast import literal_eval
>>> literal_eval('1 + 2')
3
>>> literal_eval('[1, 2, 3]')
[1, 2, 3]
>>> literal_eval('abs(1)')
ValueError: malformed node or string
```

Coroutines

- Coroutines have a lot in common with threads, but unlike threads, they only give up control when they call another coroutine and they don't use as much memory.
- Coroutine definition starts with `'async'` and its call with `'await'`.
- `'asyncio.run(<coroutine>)'` is the main entry point for asynchronous programs.
- Functions wait(), gather() and as_completed() can be used when multiple coroutines need to be started at the same time.
- Asyncio module also provides its own Queue, Event, Lock and Semaphore classes.

Runs a terminal game where you control an asterisk that must avoid numbers:

```
import asyncio, collections, curses, enum, random

P = collections.namedtuple('P', 'x y')          # Position
D = enum.Enum('D', 'n e s w')                   # Direction

def main(screen):
    curses.curs_set(0)                          # Makes cursor invisible.
    screen.nodelay(True)                        # Makes getch() non-blocking.
    asyncio.run(main_coroutine(screen))         # Starts running asyncio code.

async def main_coroutine(screen):
    state = {'*': P(0, 0), **{id_: P(30, 10) for id_ in range(10)}}
    moves = asyncio.Queue()
    coros = (*(random_controller(id_, moves) for id_ in range(10)),
             human_controller(screen, moves),
             model(moves, state, *screen.getmaxyx()),
             view(state, screen))
    await asyncio.wait(coros, return_when=asyncio.FIRST_COMPLETED)

async def random_controller(id_, moves):
    while True:
        moves.put_nowait((id_, random.choice(list(D))))
        await asyncio.sleep(random.random() / 2)

async def human_controller(screen, moves):
    while True:
        ch = screen.getch()
        key_mappings = {259: D.n, 261: D.e, 258: D.s, 260: D.w}
        if ch in key_mappings:
            moves.put_nowait(('*', key_mappings[ch]))
        await asyncio.sleep(0.01)

async def model(moves, state, height, width):
    while state['*'] not in {p for id_, p in state.items() if id_ != '*'}:
        id_, d = await moves.get()
        p      = state[id_]
        deltas = {D.n: P(0, -1), D.e: P(1, 0), D.s: P(0, 1), D.w: P(-1, 0)}
        new_p  = P(*[sum(a) for a in zip(p, deltas[d])])
        if 0 <= new_p.x < width-1 and 0 <= new_p.y < height:
```

```
            state[id_] = new_p

async def view(state, screen):
    while True:
        screen.clear()
        for id_, p in state.items():
            screen.addstr(p.y, p.x, str(id_))
        await asyncio.sleep(0.01)

curses.wrapper(main)
```

Libraries

Progress Bar

```
# $ pip3 install tqdm
from tqdm import tqdm
from time import sleep
for el in tqdm([1, 2, 3]):
    sleep(0.2)
```

Plot

```
# $ pip3 install matplotlib
from matplotlib import pyplot
pyplot.plot(<y_data> [, label=<str>])
pyplot.plot(<x_data>, <y_data>)
pyplot.legend()                                 # Adds a legend.
pyplot.savefig('<path>')                        # Saves the figure.
pyplot.show()                                   # Displays the figure.
pyplot.clf()                                    # Clears the figure.
```

Table

Prints a CSV file as an ASCII table:

```
# $ pip3 install tabulate
import csv, tabulate
with open('test.csv', encoding='utf-8', newline='') as file:
    rows   = csv.reader(file)
    header = [a.title() for a in next(rows)]
    table  = tabulate.tabulate(rows, header)
    print(table)
```

Curses

Clears the terminal, prints a message and waits for the ESC key press:

```
from curses import wrapper, curs_set, ascii
from curses import KEY_UP, KEY_RIGHT, KEY_DOWN, KEY_LEFT

def main():
    wrapper(draw)

def draw(screen):
    curs_set(0)                                 # Makes cursor invisible.
    screen.nodelay(True)                        # Makes getch() non-blocking.
    screen.clear()
    screen.addstr(0, 0, 'Press ESC to quit.')  # Coordinates are y, x.
    while screen.getch() != ascii.ESC:
        pass

def get_border(screen):
    from collections import namedtuple
    P = namedtuple('P', 'x y')
    height, width = screen.getmaxyx()
    return P(width-1, height-1)

if __name__ == '__main__':
    main()
```

Logging

```
# $ pip3 install loguru
from loguru import logger
```

```
logger.add('debug_{time}.log', colorize=True)  # Connects a log file.
logger.add('error_{time}.log', level='ERROR')  # Another file for errors or higher.
logger.<level>('A logging message.')
```

- **Levels: `'debug'`, `'info'`, `'success'`, `'warning'`, `'error'`, `'critical'`.**

Exceptions

Exception description, stack trace and values of variables are appended automatically.

```
try:
    ...
except <exception>:
    logger.exception('An error happened.')
```

Rotation

Argument that sets a condition when a new log file is created.

```
rotation=<int>|<datetime.timedelta>|<datetime.time>|<str>
```

- **`'<int>'` - Max file size in bytes.**
- **`'<timedelta>'` - Max age of a file.**
- **`'<time>'` - Time of day.**
- **`'<str>'` - Any of above as a string: `'100 MB'`, `'1 month'`, `'monday at 12:00'`, ...**

Retention

Sets a condition which old log files get deleted.

```
retention=<int>|<datetime.timedelta>|<str>
```

- `'<int>'` - Max number of files.
- `'<timedelta>'` - Max age of a file.
- `'<str>'` - Max age as a string: `'1 week, 3 days'`, `'2 months'`, ...

Scraping

Scrapes Python's URL, version number and logo from Wikipedia page:

```
# $ pip3 install requests beautifulsoup4
import requests, sys
from bs4 import BeautifulSoup
URL = 'https://en.wikipedia.org/wiki/Python_(programming_language)'
try:
    html  = requests.get(URL).text
    doc   = BeautifulSoup(html, 'html.parser')
    table = doc.find('table', class_='infobox vevent')
    rows  = table.find_all('tr')
    link  = rows[11].find('a')['href']
    ver   = rows[6].find('div').text.split()[0]
    url_i = rows[0].find('img')['src']
    image = requests.get(f'https:{url_i}').content
    with open('test.png', 'wb') as file:
        file.write(image)
    print(link, ver)
except requests.exceptions.ConnectionError:
    print("You've got problems with connection.", file=sys.stderr)
```

Web

```
# $ pip3 install bottle
from bottle import run, route, static_file, template, post, request, response
import json
```

Run

```
run(host='localhost', port=8080)        # Runs locally.
run(host='0.0.0.0', port=80)            # Runs globally.
```

Static Request

```
@route('/img/<image>')
def send_image(image):
    return static_file(image, 'img_dir/', mimetype='image/png')
```

Dynamic Request

```
@route('/<sport>')
def send_page(sport):
    return template('<h1>{{title}}</h1>', title=sport)
```

REST Request

```
@post('/odds/<sport>')
def odds_handler(sport):
    team = request.forms.get('team')
    home_odds, away_odds = 2.44, 3.29
    response.headers['Content-Type'] = 'application/json'
    response.headers['Cache-Control'] = 'no-cache'
    return json.dumps([team, home_odds, away_odds])
```

Test:

```
# $ pip3 install requests
>>> import requests
>>> url  = 'http://localhost:8080/odds/football'
>>> data = {'team': 'arsenal f.c.'}
>>> response = requests.post(url, data=data)
>>> response.json()
['arsenal f.c.', 2.44, 3.29]
```

Profiling

Stopwatch

```
from time import time
start_time = time()                   # Seconds since the Epoch.
...
duration = time() - start_time
```

High performance:

```
from time import perf_counter
start_time = perf_counter()           # Seconds since restart.
...
duration = perf_counter() - start_time
```

Timing a Snippet

```
>>> from timeit import timeit
>>> timeit('"-".join(str(a) for a in range(100))',
...        number=10000, globals=globals(), setup='pass')
0.34986
```

Profiling by Line

```
# $ pip3 install line_profiler memory_profiler
@profile
def main():
    a = [*range(10000)]
    b = {*range(10000)}
main()
```

```
$ kernprof -lv test.py
Line #   Hits     Time  Per Hit   % Time  Line Contents
==============================================================
     1                                           @profile
     2                                           def main():
     3      1   1128.0   1128.0     27.4      a = [*range(10000)]
     4      1   2994.0   2994.0     72.6      b = {*range(10000)}
```

```
$ python3 -m memory_profiler test.py
Line #         Mem usage      Increment   Line Contents
================================================
     1        35.387 MiB     35.387 MiB   @profile
     2                                     def main():
     3        35.734 MiB      0.348 MiB       a = [*range(10000)]
     4        36.160 MiB      0.426 MiB       b = {*range(10000)}
```

Call Graph

Generates a PNG image of a call graph with highlighted bottlenecks:

```
# $ pip3 install pycallgraph
from pycallgraph import output, PyCallGraph
from datetime import datetime
time_str = datetime.now().strftime('%Y%m%d%H%M%S')
filename = f'profile-{time_str}.png'
drawer = output.GraphvizOutput(output_file=filename)
with PyCallGraph(drawer):
    <code_to_be_profiled>
```

NumPy

Array manipulation mini-language. It can run up to one hundred times faster than the equivalent Python code.

```
# $ pip3 install numpy
import numpy as np
```

```
<array> = np.array(<list>)
<array> = np.arange(from_inclusive, to_exclusive, ±step_size)
<array> = np.ones(<shape>)
<array> = np.random.randint(from_inclusive, to_exclusive, <shape>)
```

```
<array>.shape = <shape>
<view>  = <array>.reshape(<shape>)
<view>  = np.broadcast_to(<array>, <shape>)
```

```
<array> = <array>.sum(axis)
indexes = <array>.argmin(axis)
```

- **Shape is a tuple of dimension sizes.**
- **Axis is the index of a dimension that gets collapsed. The leftmost dimension has index 0.**

Indexing

```
<el>       = <2d_array>[0, 0]        # First element.
<1d_view>  = <2d_array>[0]           # First row.
<1d_view>  = <2d_array>[:, 0]        # First column. Also [..., 0].
<3d_view>  = <2d_array>[None, :, :]  # Expanded by dimension of size 1.
```

```
<1d_array> = <2d_array>[<1d_row_indexes>, <1d_column_indexes>]
<2d_array> = <2d_array>[<2d_row_indexes>, <2d_column_indexes>]
```

```
<2d_bools> = <2d_array> > 0
<1d_array> = <2d_array>[<2d_bools>]
```

- **If row and column indexes differ in shape, they are combined with broadcasting.**

Broadcasting

Broadcasting is a set of rules by which NumPy functions operate on arrays of different sizes and/or dimensions.

```
left  = [[0.1], [0.6], [0.8]]        # Shape: (3, 1)
right = [ 0.1 ,  0.6 ,  0.8 ]       # Shape: (3)
```

1. If array shapes differ in length, left-pad the shorter shape with ones:

```
left  = [[0.1], [0.6], [0.8]]        # Shape: (3, 1)
right = [[0.1 ,  0.6 ,  0.8]]       # Shape: (1, 3) <- !
```

2. If any dimensions differ in size, expand the ones that have size 1 by duplicating their elements:

```
left  = [[0.1, 0.1, 0.1], [0.6, 0.6, 0.6], [0.8, 0.8, 0.8]]  # Shape: (3, 3) <- !
right = [[0.1, 0.6, 0.8], [0.1, 0.6, 0.8], [0.1, 0.6, 0.8]]  # Shape: (3, 3) <- !
```

3. If neither non-matching dimension has size 1, raise an error.

Example

For each point returns index of its nearest point (`[0.1, 0.6, 0.8] => [1, 2, 1]`):

```
>>> points = np.array([0.1, 0.6, 0.8])
 [ 0.1,  0.6,  0.8]
>>> wrapped_points = points.reshape(3, 1)
[[ 0.1],
 [ 0.6],
 [ 0.8]]
>>> distances = wrapped_points - points
[[ 0. , -0.5, -0.7],
 [ 0.5,  0. , -0.2],
 [ 0.7,  0.2,  0. ]]
>>> distances = np.abs(distances)
[[ 0. ,  0.5,  0.7],
 [ 0.5,  0. ,  0.2],
 [ 0.7,  0.2,  0. ]]
>>> i = np.arange(3)
[0, 1, 2]
>>> distances[i, i] = np.inf
[[ inf,  0.5,  0.7],
 [ 0.5,  inf,  0.2],
 [ 0.7,  0.2,  inf]]
>>> distances.argmin(1)
[1, 2, 1]
```

Image

```
# $ pip3 install pillow
from PIL import Image
```

```
<Image> = Image.new('<mode>', (width, height))
<Image> = Image.open('<path>')
<Image> = <Image>.convert('<mode>')
<Image>.save('<path>')
<Image>.show()
```

```
<tuple/int> = <Image>.getpixel((x, y))          # Returns a pixel.
<Image>.putpixel((x, y), <tuple/int>)           # Writes a pixel to the image.
<ImagingCore> = <Image>.getdata()               # Returns a sequence of pixels.
<Image>.putdata(<list/ImagingCore>)             # Writes a sequence of pixels.
<Image>.paste(<Image>, (x, y))                  # Writes an image to the image.
```

```
<2d_array> = np.array(<Image>)                  # Creates NumPy array from greyscale image.
<3d_array> = np.array(<Image>)                  # Creates NumPy array from color image.
<Image>    = Image.fromarray(<array>)           # Creates image from NumPy array of floats.
```

Modes

- `'1'` - 1-bit pixels, black and white, stored with one pixel per byte.
- `'L'` - 8-bit pixels, greyscale.
- `'RGB'` - 3x8-bit pixels, true color.
- `'RGBA'` - 4x8-bit pixels, true color with transparency mask.
- `'HSV'` - 3x8-bit pixels, Hue, Saturation, Value color space.

Examples

Creates a PNG image of a rainbow gradient:

```
WIDTH, HEIGHT = 100, 100
size = WIDTH * HEIGHT
hues = [255 * i/size for i in range(size)]
img = Image.new('HSV', (WIDTH, HEIGHT))
img.putdata([(int(h), 255, 255) for h in hues])
img.convert('RGB').save('test.png')
```

Adds noise to a PNG image:

```
from random import randint
add_noise = lambda value: max(0, min(255, value + randint(-20, 20)))
img = Image.open('test.png').convert('HSV')
img.putdata([(add_noise(h), s, v) for h, s, v in img.getdata()])
img.convert('RGB').save('test.png')
```

Drawing

```
from PIL import ImageDraw
```

```
<ImageDraw> = ImageDraw.Draw(<Image>)
<ImageDraw>.point((x, y), fill=None)
<ImageDraw>.line((x1, y1, x2, y2 [, ...]), fill=None, width=0, joint=None)
<ImageDraw>.arc((x1, y1, x2, y2), from_deg, to_deg, fill=None, width=0)
<ImageDraw>.rectangle((x1, y1, x2, y2), fill=None, outline=None, width=0)
<ImageDraw>.polygon((x1, y1, x2, y2 [, ...]), fill=None, outline=None)
<ImageDraw>.ellipse((x1, y1, x2, y2), fill=None, outline=None, width=0)
```

- **Use `'fill=<color>'` to set the primary color.**
- **Use `'outline=<color>'` to set the secondary color.**
- **Color can be specified as a tuple, int, `'#rrggbb'` string or a color name.**

Animation

Creates a GIF of a bouncing ball:

```
# $ pip3 install pillow imageio
from PIL import Image, ImageDraw
import imageio
WIDTH, R = 126, 10
frames = []
for velocity in range(15):
    y = sum(range(velocity+1))
    frame = Image.new('L', (WIDTH, WIDTH))
    draw  = ImageDraw.Draw(frame)
    draw.ellipse((WIDTH/2-R, y, WIDTH/2+R, y+R*2), fill='white')
    frames.append(frame)
frames += reversed(frames[1:-1])
imageio.mimsave('test.gif', frames, duration=0.03)
```

Audio

```
import wave
```

```
<Wave_read>  = wave.open('<path>', 'rb')        # Opens the WAV file.
framerate    = <Wave_read>.getframerate()       # Number of frames per second.
nchannels    = <Wave_read>.getnchannels()       # Number of samples per frame.
sampwidth    = <Wave_read>.getsampwidth()       # Sample size in bytes.
nframes      = <Wave_read>.getnframes()         # Number of frames.
<params>     = <Wave_read>.getparams()          # Immutable collection of above.
<bytes>      = <Wave_read>.readframes(nframes)  # Returns next 'nframes' frames.
```

```
<Wave_write> = wave.open('<path>', 'wb')        # Truncates existing file.
<Wave_write>.setframerate(<int>)                # 44100 for CD, 48000 for video.
<Wave_write>.setnchannels(<int>)                # 1 for mono, 2 for stereo.
<Wave_write>.setsampwidth(<int>)                # 2 for CD quality sound.
<Wave_write>.setparams(<params>)                # Sets all parameters.
<Wave_write>.writeframes(<bytes>)               # Appends frames to the file.
```

- **Bytes object contains a sequence of frames, each consisting of one or more samples.**
- **In a stereo signal, the first sample of a frame belongs to the left channel.**
- **Each sample consists of one or more bytes that, when converted to an integer, indicate the displacement of a speaker membrane at a given moment.**
- **If sample width is one, then the integer should be encoded unsigned.**
- **For all other sizes, the integer should be encoded signed with little-endian byte order.**

Sample Values

sampwidth	min	zero	max
1	0	128	255
2	-32768	0	32767
3	-8388608	0	8388607
4	-2147483648	0	2147483647

Read Float Samples from WAV File

```
def read_wav_file(filename):
    def get_int(a_bytes):
        an_int = int.from_bytes(a_bytes, 'little', signed=width!=1)
        return an_int - 128 * (width == 1)
    with wave.open(filename, 'rb') as file:
        width  = file.getsampwidth()
        frames = file.readframes(-1)
    byte_samples = (frames[i: i + width] for i in range(0, len(frames), width))
    return [get_int(b) / pow(2, width * 8 - 1) for b in byte_samples]
```

Write Float Samples to WAV File

```
def write_to_wav_file(filename, float_samples, nchannels=1, sampwidth=2, framerate=44100):
    def get_bytes(a_float):
        a_float = max(-1, min(1 - 2e-16, a_float))
        a_float += sampwidth == 1
        a_float *= pow(2, sampwidth * 8 - 1)
        return int(a_float).to_bytes(sampwidth, 'little', signed=sampwidth!=1)
    with wave.open(filename, 'wb') as file:
        file.setnchannels(nchannels)
        file.setsampwidth(sampwidth)
        file.setframerate(framerate)
        file.writeframes(b''.join(get_bytes(f) for f in float_samples))
```

Examples

Saves a sine wave to a mono WAV file:

```
from math import pi, sin
samples_f = (sin(i * 2 * pi * 440 / 44100) for i in range(100000))
write_to_wav_file('test.wav', samples_f)
```

Adds noise to a mono WAV file:

```
from random import random
add_noise = lambda value: value + (random() - 0.5) * 0.03
samples_f = (add_noise(f) for f in read_wav_file('test.wav'))
write_to_wav_file('test.wav', samples_f)
```

Plays a WAV file:

```
# $ pip3 install simpleaudio
from simpleaudio import play_buffer
with wave.open('test.wav', 'rb') as file:
    p = file.getparams()
    frames = file.readframes(-1)
    play_buffer(frames, p.nchannels, p.sampwidth, p.framerate)
```

Text to Speech

```
# $ pip3 install pyttsx3
import pyttsx3
engine = pyttsx3.init()
engine.say('Sally sells seashells by the seashore.')
engine.runAndWait()
```

Synthesizer

Plays Popcorn by Gershon Kingsley:

```
# $ pip3 install simpleaudio
import simpleaudio, math, struct
from itertools import chain, repeat
F  = 44100
P1 = '71♪,69,,71♪,66,,62♪,66,,59♪,,,'
P2 = '71♪,73,,74♪,73,,74,,71,,73♪,71,,73,,69,,71♪,69,,71,,67,,71♪,,,'
get_pause   = lambda seconds: repeat(0, int(seconds * F))
sin_f       = lambda i, hz: math.sin(i * 2 * math.pi * hz / F)
get_wave    = lambda hz, seconds: (sin_f(i, hz) for i in range(int(seconds * F)))
get_hz      = lambda key: 8.176 * 2 ** (int(key) / 12)
parse_note  = lambda note: (get_hz(note[:2]), 0.25 if '♪' in note else 0.125)
get_samples = lambda note: get_wave(*parse_note(note)) if note else get_pause(0.125)
samples_f   = chain.from_iterable(get_samples(n) for n in f'{P1}{P1}{P2}'.split(','))
samples_b   = b''.join(struct.pack('<h', int(f * 30000)) for f in samples_f)
simpleaudio.play_buffer(samples_b, 1, 2, F)
```

Pygame

Basic Example

```
# $ pip3 install pygame
import pygame as pg
pg.init()
screen = pg.display.set_mode((500, 500))
rect = pg.Rect(240, 240, 20, 20)
while all(event.type != pg.QUIT for event in pg.event.get()):
    deltas = {pg.K_UP: (0, -3), pg.K_RIGHT: (3, 0), pg.K_DOWN: (0, 3), pg.K_LEFT: (-3, 0)}
    for delta in (deltas.get(i) for i, on in enumerate(pg.key.get_pressed()) if on):
        rect = rect.move(delta) if delta else rect
    screen.fill((0, 0, 0))
    pg.draw.rect(screen, (255, 255, 255), rect)
    pg.display.flip()
```

Rectangle

Object for storing rectangular coordinates.

```
<Rect> = pg.Rect(x, y, width, height)          # X and y are coordinates of topleft corner.
<int>  = <Rect>.x/y/centerx/centery/…           # Top, right, bottom, left.
<tup.> = <Rect>.topleft/center/…               # Topright, bottomright, bottomleft.
<Rect> = <Rect>.move((x, y))                   # Use move_ip() to move in place.
```

```
<bool> = <Rect>.collidepoint((x, y))           # Tests if a point is inside a rectangle.
<bool> = <Rect>.colliderect(<Rect>)            # Tests if two rectangles overlap.
<int>  = <Rect>.collidelist(<list_of_Rect>)    # Returns index of first colliding Rect or -1.
<list> = <Rect>.collidelistall(<list_of_Rect>) # Returns indexes of all colliding Rects.
```

Surface

Object for representing images.

```
<Surf> = pg.display.set_mode((width, height))   # Returns the display surface.
<Surf> = pg.Surface((width, height))            # Creates a new surface.
<Surf> = pg.image.load('<path>')                # Loads the image.
<Surf> = <Surf>.subsurface(<Rect>)              # Returns a subsurface.
```

```
<Surf>.fill(color)                              # Fills the whole surface.
<Surf>.set_at((x, y), color)                    # Updates pixel.
<Surf>.blit(<Surface>, (x, y))                  # Draws passed surface to the surface.
```

```
<Surf> = pg.transform.flip(<Surf>, xbool, ybool)
<Surf> = pg.transform.rotate(<Surf>, degrees)
<Surf> = pg.transform.scale(<Surf>, (width, height))
```

```
pg.draw.line(<Surf>, color, (x1, y1), (x2, y2), width)
pg.draw.arc(<Surf>, color, <Rect>, from_radians, to_radians)
pg.draw.rect(<Surf>, color, <Rect>)
pg.draw.polygon(<Surf>, color, points)
pg.draw.ellipse(<Surf>, color, <Rect>)
```

Font

```
<Font> = pg.font.SysFont('<name>', size, bold=False, italic=False)
<Font> = pg.font.Font('<path>', size)
<Surf> = <Font>.render(text, antialias, color, background=None)
```

Sound

```
<Sound> = pg.mixer.Sound('<path>')              # Loads the WAV file.
<Sound>.play()                                  # Starts playing the sound.
```

Basic Mario Brothers Example

```
import collections, dataclasses, enum, io, pygame, urllib.request, itertools as it
from random import randint

P = collections.namedtuple('P', 'x y')          # Position
D = enum.Enum('D', 'n e s w')                   # Direction
SIZE, MAX_SPEED = 50, P(5, 10)                  # Screen size, Speed limit

def main():
    def get_screen():
        pygame.init()
        return pygame.display.set_mode(2 * [SIZE*16])
    def get_images():
        url = 'https://gto76.github.io/python-cheatsheet/web/mario_bros.png'
        img = pygame.image.load(io.BytesIO(urllib.request.urlopen(url).read()))
        return [img.subsurface(get_rect(x, 0)) for x in range(img.get_width() // 16)]
    def get_mario():
        Mario = dataclasses.make_dataclass('Mario', 'rect spd facing_left frame_cycle'.split())
        return Mario(get_rect(1, 1), P(0, 0), False, it.cycle(range(3)))
    def get_tiles():
        positions = [p for p in it.product(range(SIZE), repeat=2) if {*p} & {0, SIZE-1}] + \
            [(randint(1, SIZE-2), randint(2, SIZE-2)) for _ in range(SIZE**2 // 10)]
        return [get_rect(*p) for p in positions]
    def get_rect(x, y):
        return pygame.Rect(x*16, y*16, 16, 16)
    run(get_screen(), get_images(), get_mario(), get_tiles())

def run(screen, images, mario, tiles):
    clock = pygame.time.Clock()
    while all(event.type != pygame.QUIT for event in pygame.event.get()):
        keys = {pygame.K_UP: D.n, pygame.K_RIGHT: D.e, pygame.K_DOWN: D.s, pygame.K_LEFT: D.w}
        pressed = {keys.get(i) for i, on in enumerate(pygame.key.get_pressed()) if on}
        update_speed(mario, tiles, pressed)
        update_position(mario, tiles)
        draw(screen, images, mario, tiles, pressed)
        clock.tick(28)

def update_speed(mario, tiles, pressed):
    x, y = mario.spd
    x += 2 * ((D.e in pressed) - (D.w in pressed))
```

```
    x -= x // abs(x) if x else 0
    y += 1 if D.s not in get_boundaries(mario.rect, tiles) else (-10 if D.n in pressed else 0)
    mario.spd = P(*[max(-limit, min(limit, s)) for limit, s in zip(MAX_SPEED, P(x, y))])

def update_position(mario, tiles):
    new_p = mario.rect.topleft
    larger_speed = max(abs(s) for s in mario.spd)
    for _ in range(larger_speed):
        mario.spd = stop_on_collision(mario.spd, get_boundaries(mario.rect, tiles))
        new_p = P(*[a + s/larger_speed for a, s in zip(new_p, mario.spd)])
        mario.rect.topleft = new_p

def get_boundaries(rect, tiles):
    deltas = {D.n: P(0, -1), D.e: P(1, 0), D.s: P(0, 1), D.w: P(-1, 0)}
    return {d for d, delta in deltas.items() if rect.move(delta).collidelist(tiles) != -1}

def stop_on_collision(spd, bounds):
    return P(x=0 if (D.w in bounds and spd.x < 0) or (D.e in bounds and spd.x > 0) else spd.x,
             y=0 if (D.n in bounds and spd.y < 0) or (D.s in bounds and spd.y > 0) else spd.y)

def draw(screen, images, mario, tiles, pressed):
    def get_frame_index():
        if D.s not in get_boundaries(mario.rect, tiles):
            return 4
        return next(mario.frame_cycle) if {D.w, D.e} & pressed else 6
    screen.fill((85, 168, 255))
    mario.facing_left = (D.w in pressed) if {D.w, D.e} & pressed else mario.facing_left
    screen.blit(images[get_frame_index() + mario.facing_left * 9], mario.rect)
    for rect in tiles:
        screen.blit(images[18 if {*rect.topleft} & {0, (SIZE-1)*16} else 19], rect)
    pygame.display.flip()

if __name__ == '__main__':
    main()
```

Pandas

```
# $ pip3 install pandas
import pandas as pd
from pandas import Series, DataFrame
```

Series

Ordered dictionary with a name.

```
>>> Series([1, 2], index=['x', 'y'], name='a')
x    1
y    2
Name: a, dtype: int64
```

```
<Sr> = Series(<list>)                          # Assigns RangeIndex starting at 0.
<Sr> = Series(<dict>)                          # Takes dictionary's keys for index.
<Sr> = Series(<dict/Series>, index=<list>)     # Only keeps items with keys specified in index.
```

```
<el> = <Sr>.loc[key]                           # Or: <Sr>.iloc[index]
<Sr> = <Sr>.loc[keys]                          # Or: <Sr>.iloc[indexes]
<Sr> = <Sr>.loc[from_key : to_key_inclusive]   # Or: <Sr>.iloc[from_i : to_i_exclusive]
```

```
<el> = <Sr>[key/index]                         # Or: <Sr>.key
<Sr> = <Sr>[keys/indexes]                      # Or: <Sr>[<key_range/range>]
<Sr> = <Sr>[bools]                             # Or: <Sr>.i/loc[bools]
```

```
<Sr> = <Sr> ><== <el/Sr>                       # Returns a Series of bools.
<Sr> = <Sr> +-*/ <el/Sr>                       # Non-matching keys get value NaN.
```

```
<Sr> = <Sr>.append(<Sr>)                    # Or: pd.concat(<coll_of_Sr>)
<Sr> = <Sr>.combine_first(<Sr>)             # Adds items that are not yet present.
<Sr>.update(<Sr>)                           # Updates items that are already present.
```

Aggregate, Transform, Map:

```
<el> = <Sr>.sum/max/mean/idxmax/all()       # Or: <Sr>.aggregate(<agg_func>)
<Sr> = <Sr>.rank/diff/cumsum/ffill/interpl() # Or: <Sr>.agg/transform(<trans_func>)
<Sr> = <Sr>.fillna(<el>)                    # Or: <Sr>.apply/agg/transform/map(<map_func>)
```

- **The way `'aggregate()'` and `'transform()'` find out whether a function accepts an element or the whole Series is by passing it a single value at first and if it raises an error, then they pass it the whole Series.**

```
>>> sr = Series([1, 2], index=['x', 'y'])
x    1
y    2
```

	`'sum'`	`['sum']`	`{'s': 'sum'}`
`sr.apply(…)` `sr.agg(…)`	`3`	`sum  3`	`s  3`

	`'rank'`	`['rank']`	`{'r': 'rank'}`

`sr.apply(…)`
`sr.agg(…)`
`sr.trans(…)`
	`x  1`
	`y  2`
		`rank`
		`x  1`
		`y  2`
			`r  x  1`
			`y  2`

- **Last result has a hierarchical index. Use `'<Sr>[key_1, key_2]'` to get its values.**

DataFrame

Table with labeled rows and columns.

```
>>> DataFrame([[1, 2], [3, 4]], index=['a', 'b'], columns=['x', 'y'])
   x  y
a  1  2
b  3  4
```

```
<DF>    = DataFrame(<list_of_rows>)          # Rows can be either lists, dicts or series.
<DF>    = DataFrame(<dict_of_columns>)       # Columns can be either lists, dicts or series.
```

```
<el>    = <DF>.loc[row_key, column_key]      # Or: <DF>.iloc[row_index, column_index]
<Sr/DF> = <DF>.loc[row_key/s]                # Or: <DF>.iloc[row_index/es]
<Sr/DF> = <DF>.loc[:, column_key/s]          # Or: <DF>.iloc[:, column_index/es]
<DF>    = <DF>.loc[row_bools, column_bools]  # Or: <DF>.iloc[row_bools, column_bools]
```

```
<Sr/DF> = <DF>[column_key/s]                 # Or: <DF>.column_key
<DF>    = <DF>[row_bools]                    # Keeps rows as specified by bools.
<DF>    = <DF>[<DF_of_bools>]                # Assigns NaN to False values.
```

```
<DF>    = <DF> ><== <el/Sr/DF>               # Returns DataFrame of bools.
<DF>    = <DF> +-*/ <el/Sr/DF>               # Non-matching keys get value NaN.
```

```
<DF>    = <DF>.set_index(column_key)         # Replaces row keys with values from a column.
<DF>    = <DF>.reset_index()                 # Moves row keys to their own column.
<DF>    = <DF>.filter('<regex>', axis=1)     # Only keeps columns whose key matches the regex.
<DF>    = <DF>.melt(id_vars=column_key/s)    # Converts DF from wide to long format.
```

Merge, Join, Concat:

```
>>> l = DataFrame([[1, 2], [3, 4]], index=['a', 'b'], columns=['x', 'y'])
   x  y
a  1  2
b  3  4
>>> r = DataFrame([[4, 5], [6, 7]], index=['b', 'c'], columns=['y', 'z'])
   y  z
b  4  5
c  6  7
```

how/join	'outer'	'inner'	'left'	description

`l.merge(r, on='y', how=…)`	`  x  y  z`
	`0 1  2  .`
	`1 3  4  5`
	`2 .  6  7`
		`x  y  z`
		`3  4  5`
			`x  y  z`
			`1  2  .`
			`3  4  5`
				Joins/merges on column. Also accepts left_on and right_on parameters. Uses 'inner' by default.

`l.join(r, lsuffix='l', rsuffix='r', how=…)`	`  x yl yr  z`
	`a 1  2  .  .`
	`b 3  4  4  5`
	`c .  .  6  7`
		`x yl yr  z`
		`3  4  4  5`
			`x yl yr  z`
			`1  2  .  .`
			`3  4  4  5`
				Joins/merges on row_keys. Uses 'left' by default.

`pd.concat([l, r], axis=0, join=…)`	`  x  y  z`
	`a 1  2  .`
	`b 3  4  .`
	`b .  4  5`
	`c .  6  7`
		`y`
		`2`
		`4`
		`4`
		`6`
				Adds rows at the bottom. Uses 'outer' by default. By default works the same as `l.append(r)`.

`pd.concat([l, r], axis=1, join=…)`	`  x  y  y  z`
	`a 1  2  .  .`
	`b 3  4  4  5`
	`c .  .  6  7`
		`x  y  y  z`
		`3  4  4  5`
				Adds columns at the right end. Uses 'outer' by default.

`l.combine_first(r)`	`  x  y  z`
	`a 1  2  .`
	`b 3  4  5`
	`c .  6  7`
				Adds missing rows and columns.

Aggregate, Transform, Map:

```
<Sr> = <DF>.sum/max/mean/idxmax/all()          # Or: <DF>.apply/agg/transform(<agg_func>)
<DF> = <DF>.rank/diff/cumsum/ffill/interpl()  # Or: <DF>.apply/agg/transform(<trans_func>)
<DF> = <DF>.fillna(<el>)                       # Or: <DF>.applymap(<map_func>)
```

- **All operations operate on columns by default. Use `'axis=1'` parameter to process the rows instead.**

```
>>> df = DataFrame([[1, 2], [3, 4]], index=['a', 'b'], columns=['x', 'y'])
   x  y
a  1  2
b  3  4
```

	`'sum'`	`['sum']`	`{'x': 'sum'}`
`df.apply(…)` `df.agg(…)`	`x  4` `y  6`	`   x  y` `sum  4  6`	`x  4`

	`'rank'`	`['rank']`	`{'x': 'rank'}`

`df.apply(…)`
`df.agg(…)`
`df.trans(…)`
	`   x  y`
	`a  1  1`
	`b  2  2`
		`     x    y`
		`  rank rank`
		`a    1    1`
		`b    2    2`
			`   x`
			`a  1`
			`b  2`

- **Use `'<DF>[col_key_1, col_key_2][row_key]'` to get the fifth result's values.**

Encode, Decode:

```
<DF> = pd.read_json/html('<str/path/url>')
<DF> = pd.read_csv/pickle/excel('<path/url>')
<DF> = pd.read_sql('<query>', <connection>)
<DF> = pd.read_clipboard()
```

```
<dict> = <DF>.to_dict(['d/l/s/sp/r/i'])
<str>  = <DF>.to_json/html/csv/markdown/latex([<path>])
<DF>.to_pickle/excel(<path>)
<DF>.to_sql('<table_name>', <connection>)
```

GroupBy

Object that groups together rows of a dataframe based on the value of the passed column.

```
>>> df = DataFrame([[1, 2, 3], [4, 5, 6], [7, 8, 6]], index=list('abc'), columns=list('xyz'))
>>> df.groupby('z').get_group(3)
   x  y
a  1  2
>>> df.groupby('z').get_group(6)
   x  y
b  4  5
c  7  8
```

```
<GB> = <DF>.groupby(column_key/s)             # DF is split into groups based on passed column.
<DF> = <GB>.get_group(group_key)              # Selects a group by value of grouping column.
```

Aggregate, Transform, Map:

```
<DF> = <GB>.sum/max/mean/idxmax/all()         # Or: <GB>.apply/agg(<agg_func>)
<DF> = <GB>.rank/diff/cumsum/ffill()          # Or: <GB>.aggregate(<trans_func>)
<DF> = <GB>.fillna(<el>)                      # Or: <GB>.transform(<map_func>)
```

```
>>> gb = df.groupby('z')
      x  y  z
3: a  1  2  3
6: b  4  5  6
   c  7  8  6
```

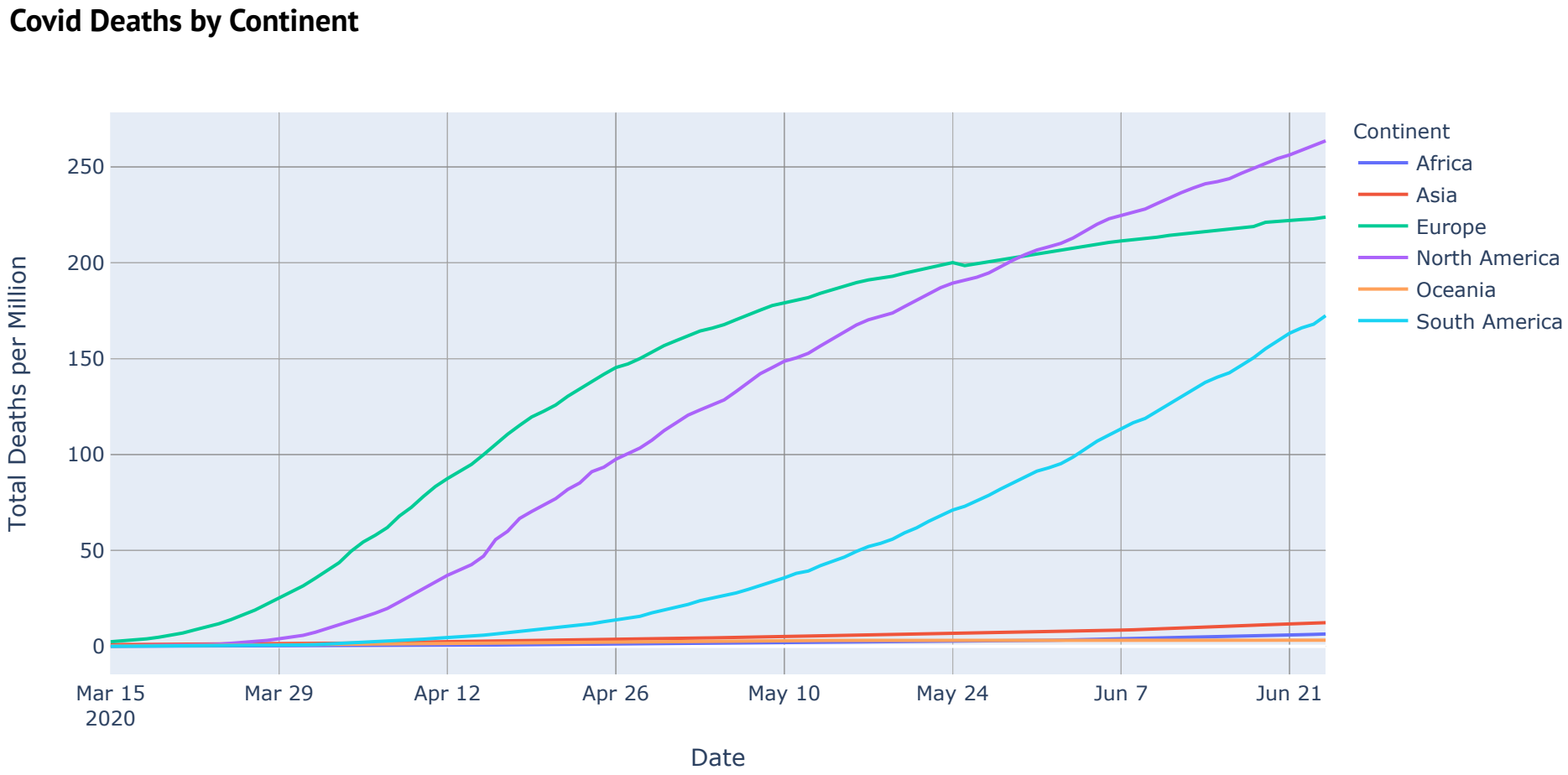
	'sum'	'rank'	['rank']	{'x': 'rank'}
gb.agg(…)	x y z 3 1 2 6 11 13	x y a 1 1 b 1 1 c 2 2	x y rank rank a 1 1 b 1 1 c 2 2	x a 1 b 1 c 2
gb.trans(…)	x y a 1 2 b 11 13 c 11 13	x y a 1 1 b 1 1 c 1 1		

Rolling

Object for rolling window calculations.

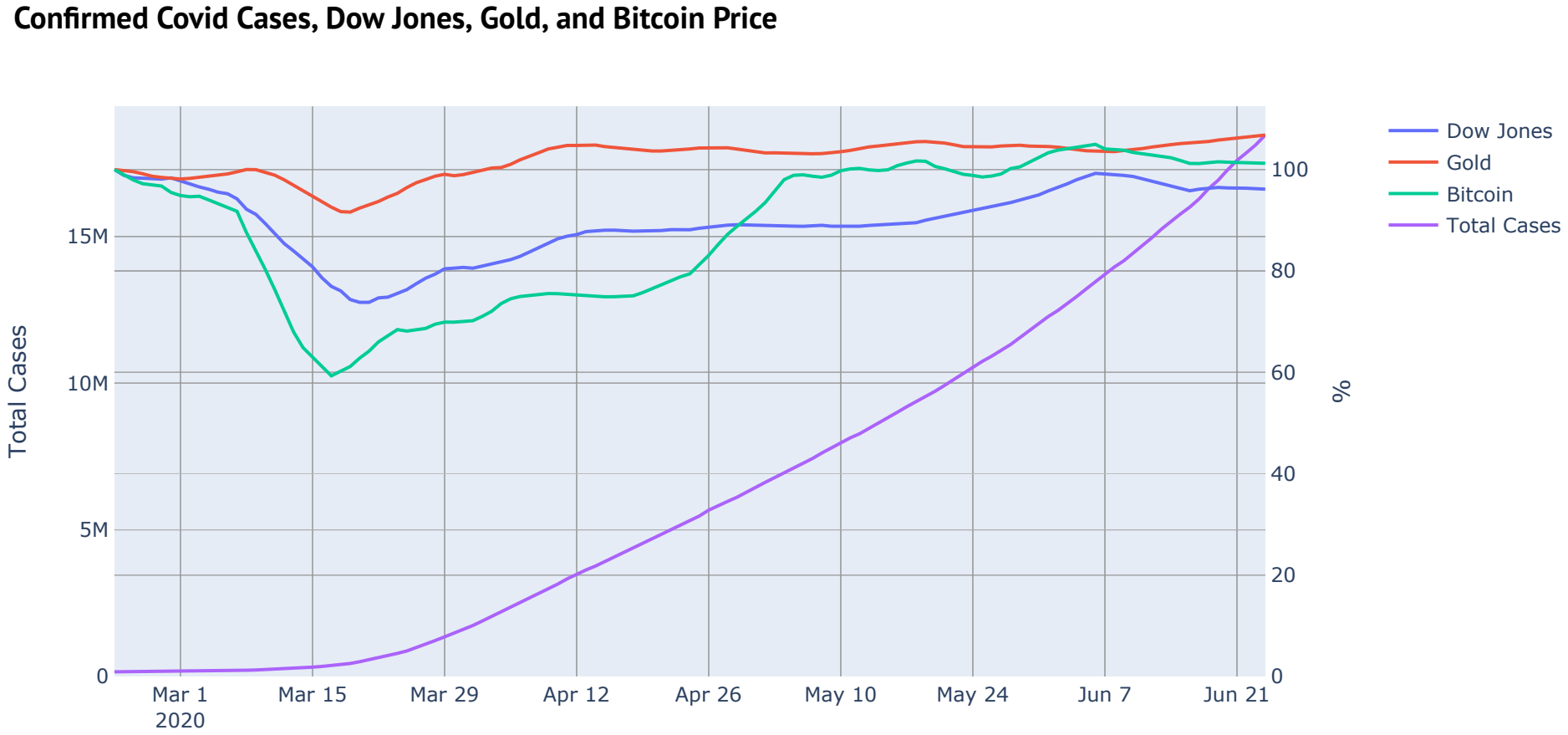
```
<R_Sr/R_DF/R_GB> = <Sr/DF/GB>.rolling(window_size)  # Also: `min_periods=None, center=False`.
<R_Sr/R_DF>      = <R_DF/R_GB>[column_key/s]        # Or: <R>.column_key
<Sr/DF/DF>       = <R_Sr/R_DF/R_GB>.sum/max/mean()  # Or: <R>.apply/agg(<agg_func/str>)
```

Plotly


Covid Deaths by Continent
Total Deaths per Million
250
200
150
100
50
0
Mar 15
2020
Mar 29
Apr 12
Apr 26
May 10
May 24
Jun 7
Jun 21
Date
Continent
Africa
Asia
Europe
North America
Oceania
South America

```
# $ pip3 install pandas plotly
import pandas as pd
import plotly.express

covid = pd.read_csv('https://covid.ourworldindata.org/data/owid-covid-data.csv',
                    usecols=['iso_code', 'date', 'total_deaths', 'population'])
continents = pd.read_csv('https://datahub.io/JohnSnowLabs/country-and-continent-codes-' + \
                         'list/r/country-and-continent-codes-list-csv.csv',
                         usecols=['Three_Letter_Country_Code', 'Continent_Name'])
df = pd.merge(covid, continents, left_on='iso_code', right_on='Three_Letter_Country_Code')
df = df.groupby(['Continent_Name', 'date']).sum().reset_index()
df['Total Deaths per Million'] = df.total_deaths * 1e6 / df.population
df = df[('2020-03-14' < df.date) & (df.date < '2020-06-25')]
df = df.rename({'date': 'Date', 'Continent_Name': 'Continent'}, axis='columns')
plotly.express.line(df, x='Date', y='Total Deaths per Million', color='Continent').show()
```


Confirmed Covid Cases, Dow Jones, Gold, and Bitcoin Price
Total Cases
15M
10M
5M
0
Mar 1
2020
Mar 15
Mar 29
Apr 12
Apr 26
May 10
May 24
Jun 7
Jun 21
%
100
80
60
40
20
0
Dow Jones
Gold
Bitcoin
Total Cases

```
# $ pip3 install pandas plotly
import pandas, datetime
import plotly.graph_objects as go

def main():
    display_data(wrangle_data(*scrape_data()))

def scrape_data():
    def scrape_yahoo(id_):
        BASE_URL = 'https://query1.finance.yahoo.com/v7/finance/download/'
        now  = int(datetime.datetime.now().timestamp())
        url  = f'{BASE_URL}{id_}?period1=1579651200&period2={now}&interval=1d&events=history'
        return pandas.read_csv(url, usecols=['Date', 'Close']).set_index('Date').Close
    covid = pd.read_csv('https://covid.ourworldindata.org/data/owid-covid-data.csv',
                        usecols=['date', 'total_cases'])
    covid = covid.groupby('date').sum()
    dow, gold, bitcoin = [scrape_yahoo(id_) for id_ in ('^DJI', 'GC=F', 'BTC-USD')]
    dow.name, gold.name, bitcoin.name = 'Dow Jones', 'Gold', 'Bitcoin'
    return covid, dow, gold, bitcoin

def wrangle_data(covid, dow, gold, bitcoin):
    df = pandas.concat([covid, dow, gold, bitcoin], axis=1)
    df = df.loc['2020-02-23':].iloc[:-2]
    df = df.interpolate()
    df.iloc[:, 1:] = df.rolling(10, min_periods=1, center=True).mean().iloc[:, 1:]
    df.iloc[:, 1:] = df.iloc[:, 1:] / df.iloc[0, 1:] * 100
    return df

def display_data(df):
    def get_trace(col_name):
        return go.Scatter(x=df.index, y=df[col_name], name=col_name, yaxis='y2')
    traces = [get_trace(col_name) for col_name in df.columns[1:]]
    traces.append(go.Scatter(x=df.index, y=df.total_cases, name='Total Cases', yaxis='y1'))
    figure = go.Figure()
    figure.add_traces(traces)
    figure.update_layout(
        yaxis1=dict(title='Total Cases', rangemode='tozero'),
        yaxis2=dict(title='%', rangemode='tozero', overlaying='y', side='right'),
        legend=dict(x=1.1)
```

```
    ).show()

if __name__ == '__main__':
    main()
```

Basic Script Template

```
#!/usr/bin/env python3
#
# Usage: .py
#

from collections import namedtuple
from dataclasses import make_dataclass
from enum import Enum
from sys import argv
import re


def main():
    pass


###
##  UTIL
#

def read_file(filename):
    with open(filename, encoding='utf-8') as file:
        return file.readlines()


if __name__ == '__main__':
    main()
```

June 27, 2020 / Jure Šorn