



Keep Those Ducks in (Type) Check!

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**Hi, I am Francesco.
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Looove Python!**

Introductory Stuff

- Standard EuroPython training (three hours with a break)
- Ask questions any time (trainings are not recorded)
- Be mindful of others when leaving & coming back
- I will be using Python 3.8 & mypy 0.711+
- Code on github.com/pythoninside/europython2019
- Follow along and have fun!

Types in Python???

Do not panic

But Why?

- Documentation
- Detect some bugs
- Performance? Maybe some day?

Saving Grace

- Code behaviour not affected
- Gradual typing

Epiphany

- Type checkers to a LOT of work
 - Maybe “static code safety checkers”?
- They are like linters on steroids (and much more)

Type Checkers

- mypy (Dropbox)
 - `shell> mypy [OPTIONS] ./some_dir/ /path/to/some/code.py`
- pyre (Facebook)
- pyright (Microsoft)
- pytype (Google)

Type Annotations

(Python 3 Syntax)

Functions

```
from typing import Callable

# Single argument
def square_root(x: float) -> float:
    return x ** .5

# Default values
def shift_left(x: int, places: int = 1) -> int:
    return x << places

# No return/return None
def greetings(name: str) -> None:
    print(f'Hello {name}')

# The type of a function/callable
fn: Callable[[int, int], int] = shift_left
```

Variables

```
from typing import Tuple

def fast_fib(n: int) -> int:
    assert n >= 0, 'Expecting a non-negative integer'

    seq: Tuple[int, int, int]
    seq = (0, 1, 1)
    if n < 3:
        return seq[n]

    nminustwo: int = 1
    nminusone: int = 1
    for i in range(3, n + 1, 1):
        nminusone, nminustwo = nminustwo + nminusone, nminusone
    return nminusone
```

Forward References

- Python 3.7+ import *annotations* (from `__future__`)
- Use the type name in quotes
- Use type comments (see next slides)

Type Annotations

(Python 2 Syntax)

Use Comments!

```
from typing import List, Union, Optional
```

```
a_complex_list = [1, '2', 3, 4, '5'] # type: List[Union[int, str]]
```

```
# Sometimes we return something, other times nothing: Optionals!
```

```
# Optional[int] = Union[int, None]
```

```
def find_element_index(el, elements):
```

```
    # type: (int, List[int]) -> Optional[int]
```

```
    if el in elements:
```

```
        return elements.index(el)
```

```
    return None # required by the type checker
```

Type Annotations

(Python 3 Syntax Continued)

Builtin Types

```
from typing import Tuple, List, Set, Dict

# Built-in types
an_integer: int = 1
a_float: float = 1.2
a_string: str = 'Hello there!'
some_bytes: bytes = b'Hello there!'
a_boolean: bool = False

# Simple collections
a_list: List[int] = [1, 2, 3]
a_set: Set[int] = {1, 2, 3}

# Tuples can be heterogeneous
a_tuple: Tuple[int, str, bool] = (1, 'foo', True)
another_tuple: Tuple[int, ...] = (1, 2, 3, 4)

# Dictionaries need types for keys and values
a_dict: Dict[str, float] = {'one': 1.0, 'two': 2.0}
```


None

```
import traceback
from typing import Optional, TypeVar

# Use None as the return type of functions which do not return a value
def greet(name: str) -> None:
    print(f'Hello {name}')
    # No need for an explicit return here

# Do not assign the result of greet to a variable
foo = greet('Francesco')

AnyException = TypeVar('AnyException', bound=Exception)

# Beware when using Optionals (which can be None)
def print_traceback(ex: Optional[AnyException]) -> None:
    # traceback.print_tb(ex.__traceback__) # type error: ex could be None!
    if ex: # type checker understands this
        traceback.print_tb(ex.__traceback__)
```

Unions & Optionals

```
from typing import List, Union, Optional
```

```
a_complex_list: List[Union[int, str]]  
a_complex_list = [1, '2', 3, 4, '5']
```

```
# Sometimes we return something, other times nothing: Optionals!
```

```
# Optional[int] = Union[int, None]
```

```
def find_element_index(el: int, elements: List[int]) -> Optional[int]:  
    if el in elements:  
        return elements.index(el)  
    return None # required by the type checker
```

Callables

```
from typing import Callable
```

```
# The type of a function/callable
```

```
# Types in lambdas are usually inferred and not annotated
```

```
fn: Callable[[int, int], int] = lambda x, y: x + y
```

```
# Callable object with any number and type of argument
```

```
decorator: Callable[..., int]
```

Coroutines & Generators

```
from asyncio import AbstractEventLoop
from socket import socket
from typing import Optional, Iterator
```

```
def my_range(n: int) -> Iterator[int]:
    # while i:=0 < n:  <- assignment expressions not supported :- (
    i = 0
    while i < n:
        yield i
        i += 1
    return 'foo'  # <- this is embed in the StopIteration exception
```

```
async def connection_handler(client: socket, loop: AbstractEventLoop) -> None:
    while True:
        data: Optional[bytes] = await loop.sock_recv(client, 10000)
        if not data:
            break
        await loop.sock_sendall(client, data)
    print('Connection closed')
    client.close()
```

Coroutines II

```
from typing import Generator
```

```
# Generator[YieldType, SendType, ReturnType]  
def echo_n_times(n: int) -> Generator[str, str, int]:  
    value = 'Please type something'  
    orig_n = n  
    while n >= 0:  
        value = yield value  
        n -= 1  
    return orig_n
```

Classes

```
from typing import ClassVar
```

```
class Point:
```

```
    x: int      # considered an instance variable  
    y: int      # considered as instance variable  
    num_points: ClassVar[int] = 0      # class variable
```

```
    def __init__(self, x: int, y: int) -> None: # Do not annotate self  
        self.x = x  
        self.y = y  
        Point.num_points += 1
```

```
class Point3D(Point):
```

```
    z: int
```

```
    def __init__(self, x: int, y: int, z: int) -> None:  
        super().__init__(x, y)  
        self.z = z
```

```
p = Point(1, 2)
```

```
# p.x = 1.2      # type error
```

```
# p.num_points += 1      # p cannot write to a class variable
```

```
print(p.num_points)      # OK
```

```
p3 = Point3D(1, 2, 3)
```

```
# p3 = p      # error: cannot use a Point in place of a Point3D
```

```
p = p3      # OK: Point3D upgraded to the super type
```

Leave Me Alone!

```
from typing import Any, List, Dict, cast
```

```
a: List      # equivalent to List[Any]  
b: Dict      # equivalent to Dict[Any, Any]
```

```
a = [1, 'foo']  
# a = 123    # this would fail  
b = {'a': 1, 'b': 'foo'}  
c = cast(str, a)    # mypy believes us  
c << 2            # mypy error as it assumes c to be a string  
c += 3            # type: ignore
```

```
def foo(x: Any) -> str:  
    print(x + 1)    # not type-checked  
    return x        # not type-checked, but return necessary
```

Advanced Topics

Optionals Can Be a Pain

```
from typing import Optional, List

def find_element_index(e1: int, elements: List[int]) -> Optional[int]:
    if e1 in elements:
        return elements.index(e1)
    return None      # required by the type checker

x = 3
xs = [1, 2, 3, 4, 5, 6]
i = find_element_index(x, xs)
print(f'{x} is element number {i + 1} of {xs!r}') # mypy error
```

Overloaded Functions

```
from typing import Optional, overload
```

```
# Example: the create_user function could be defined with Optionals only but a  
# better solution could be this:
```

```
@overload
```

```
def create_user(user_id: None) -> None:  
    ... # <- note the ellipsis
```

```
@overload
```

```
def create_user(user_id: int) -> User:  
    ... # <- note the ellipsis
```

```
# Implementation (User class defined somewhere)
```

```
def create_user(user_id: Optional[int]) -> Optional[User]:  
    if user_id is None:  
        return None  
    return User.mkuser(user_id)
```

```
user = create_user(123)  
_ = create_user(None)
```

Type Variables

```
from typing import MutableSequence, TypeVar
```

```
# Define an unbound type variable
```

```
T = TypeVar('T') # <- can be any type
```

```
# Now a bound type variable (it is actually already in the typing module, btw)
```

```
AnyStr = TypeVar('AnyStr', str, bytes) # <- can be either str or bytes
```

```
# And finally a type variable with an upper bound
```

```
AnyAnimal = TypeVar('AnyAnimal', bound=Animal)
```

```
def append(x: T, xs: MutableSequence[T]) -> None:
```

```
    return xs.append(x)
```

```
def concatenate(s1: AnyStr, s2: AnyStr) -> AnyStr:
```

```
    return s1 + s2
```

```
def greet(animal: AnyAnimal) -> None:
```

```
    print(f'Hello {animal.__class__.__name__.lower()}')
```

Type Variables II

- Placeholders for a type
- Can be read as “is a type of” or “is an instance of”
- NOT the same as Union
 - Once bound, a type variable is always the same type

Generics

```
# We can use type variables to create generic types ourselves. We have already  
# seen the use of type variables in generic types in the typing module like  
# e.g., List[T] or Dict[T, S]
```

```
from typing import Generic, List, TypeVar
```

```
T = TypeVar('T')
```

```
class Vector(Generic[T]):  
    def __init__(self, elements: List[T]) -> None:  
        self.elements = elements  
  
    def pop(self) -> T:  
        return self.elements.pop()
```

```
# We can also define generic functions
```

```
def head(v: Vector[T]) -> T:  
    # return v[0] # error: Vector does not define __getitem__  
    return v.elements[0]
```

Where Can I Use Generics?

- Things get complicated when we throw sub/super types in the mix
 - Can I use `List[int]` where `List[float]` is expected? Vice-versa?
 - What about `Tuple[int, ...]` and `Tuple[float, ...]`?
 - What about Callables?
 - ...

Variance

- Generic types are called
 - Covariant if they preserve ordering of types
 - Contravariant if they reverse that order
 - Invariant if are neither of the two forms

Variance Examples

- **Covariant**
 - Union
 - Most immutable containers
 - Callable (only in the return type)
- **Contravariant**
 - Callable (in the argument types)
- **Invariant**
 - Most mutable containers and mappings

Covariance

```
from typing import Callable
```

```
def mkint() -> int:  
    return 42
```

```
def mkfloat() -> float:  
    return 3.14
```

```
def process_float(fn: Callable[[], float]) -> None:  
    x = fn()  
    res = x ** .5  
    print(f'{x} -> {res}')
```

```
def process_int(fn: Callable[[], int]) -> None:  
    x = fn()  
    res = x << 1  
    print(f'{x} -> {res}')
```

```
# Callables are covariant in their return types. This means that we should be  
# able to use a function that return an int where one that returns a float is  
# expected (assuming that the arguments are the same).
```

```
process_float(mkint)
```

```
# The reverse is not true.
```

```
process_int(mkfloat)           # error!
```

Contravariance

```
from typing import Callable, TypeVar

T = TypeVar('T')

def proc_int(x: int) -> None:
    res = x << 1
    print(f'{x} -> {res}')

def proc_float(x: float) -> None:
    res = x ** .5
    print(f'{x} -> {res}')

def pipeline(x: T, fn: Callable[[T], None]) -> None:
    fn(x)

x: int = 42
pipeline(x, proc_float)      # OK
y: float = 3.14
pipeline(y, proc_int)       # Error
```

Invariance

```
from typing import TypeVar, Callable, List

T = TypeVar('T')

def pipeline(data: List[T], data_processor: Callable[[T], T]) -> None:
    """A simple data pipeline. """
    for el in data:
        res = data_processor(el)
        print(f'{el} -> {res}')

def int_proc(n: int) -> int:
    """Some operation not available to floats."""
    return n << 1

def float_proc(x: float) -> float:
    return x ** .5

# Can we use List[int] where List[float] is expected?
ints: List[int] = [1, 2, 3, 4, 5]
floats: List[float] = [1., 2., 3., 4., 5.]
pipeline(floats, int_proc)           # Error
pipeline(ints, float_proc)          # Error
```

Variance: Custom Generics

- User-defined Generics are **invariant** by default
 - Can specify variance by hand (in their type variables)

User-Defined Generics

```
from typing import TypeVar, Generic
```

```
T_co = TypeVar('T_co', covariant=True)
```

```
class Foo(Generic[T_co]):  
    def __init__(self, element: T_co) -> None:  
        self._x = element  
  
    def bar(self) -> None:  
        print(f'self._x = {self._x}')
```

```
x: Foo[int] = Foo(42)  
y: Foo[float] = Foo(3.14)
```

```
x = y           # Error: I cannot simply replace a Foo[int] by a Foo[float]  
y = x           # But I can replace a Foo[float] by its subtype  
# Similarly  
tx = (1, 2, 3)  
ty = (1., 2., 3.)  
tx = ty         # Error: Tuple is covariant in its arguments  
ty = tx         # OK
```

Protocols

- Structural subtyping / duck typing support
- Types defined by attributes / methods
- Subclasses of *typing.Protocol* (Python 3.8+) or *typing_extensions.Protocol*

Pre-Defined

Iterable[T]	<code>def __iter__(self) -> Iterator[T]</code>
Iterator[T]	<code>def __next__(self) -> T</code> <code>def __iter__(self) -> Iterator[T]</code>
Sized	<code>def __len__(self) -> int</code>
Container[T]	<code>def __contains__(self, x: object) -> bool</code>
Collection[T]	<code>def __len__(self) -> int</code> <code>def __iter__(self) -> Iterator[T]</code> <code>def __contains__(self, x: object) -> bool</code>
Awaitable[T]	<code>def __await__(self) -> Generator[Any, None, T]</code>
AsyncIterable[T]	<code>def __aiter__(self) -> AsyncIterator[T]</code>
AsyncIterator[T]	<code>def __anext__(self) -> Awaitable[T]</code> <code>def __aiter__(self) -> AsyncIterator[T]</code>
ContextManager[T]	<code>def __enter__(self) -> T</code> <code>def __exit__(self, exc_type: Optional[Type[BaseException]], exc_value: Optional[BaseException], traceback: Optional[TracebackType]) -> Optional[bool]</code>
AsyncContextManager[T]	<code>def __aenter__(self) -> Awaitable[T]</code> <code>def __aexit__(self, exc_type: Optional[Type[BaseException]], exc_value: Optional[BaseException], traceback: Optional[TracebackType]) -> Awaitable[Optional[bool]]</code>

Custom Protocols

```
from typing import Protocol

class Event: pass

class AppDelegate(Protocol):
    def finished_launching(self, event: Event) -> None: ...

    def should_terminate(self, event: Event) -> bool: ...

class NamedAppDelegate(AppDelegate, Protocol):
    name: str

class Application:
    delegate: AppDelegate

class Delegate:
    def __init__(self, name: str) -> None:
        self.name = name

    def finished_launching(self, event: Event) -> None:
        print(f'{self.name}: yippy!')

    def should_terminate(self, event: Event) -> bool:
        print(f'{self.name}: bye')
        return True

app = Application()
app.delegate = Delegate('foo')
```


Custom Protocols

```
from typing import Protocol

class Event: pass

class AppDelegate(Protocol):
    def finished_launching(self, event: Event) -> None: ...

    def should_terminate(self, event: Event) -> bool: ...

class NamedAppDelegate(AppDelegate, Protocol)
    name: str

class Application:
    delegate: AppDelegate

class Delegate:
    def __init__(self, name: str) -> None:
        self.name = name

    def finished_launching(self, event: Event) -> None:
        print(f'{self.name}: yippy!')

    def should_terminate(self, event: Event) -> bool:
        print(f'{self.name}: bye')
        return True

app = Application()
app.delegate = Delegate('foo')
```

Protocol Tricks

- No need to subclass a Protocol to adhere to it
- Sub-protocols: inherit from Protocol *explicitly*
 - As opposed to just subclassing the parent = implementing it
- Protocols can define std method implementations
 - But need to inherit from the protocol to get them
- Protocols can be recursive
- *isinstance()* sort of works (use *@runtime decorator*)
- Implement `__call__` to describe *Callables!*

Odds & Ends

```
# Some tricks and random convenience stuff
from typing import Iterator

# Positional-only args in callables with __
def irange(__n: int) -> Iterator[int]:
    i = 0
    while i < __n:
        yield i
        i += 1

print(list(irange(__n=10)))      # error

# Convenience shorthand for *args and **kwargs
def foo(*args: int, **kwargs: str) -> None:
    print('Hi there')

foo(1, 2, 3, a='bar', b='baz')
```

Odds & Ends II

- `MyType = int` is a type alias
- `MyType = NewType('MyType', int)` is a completely new type

Type Annotations

(Stubs)

Stub Files

- Same name as the corresponding Python file, with .pyi extension
- Use Python 3.6+ syntax (even for Python 2 code)
- Only include declarations, no logic
- Logic is replaced by “...” (ellipsis)
- mypy ships with many stub files for stdlib etc.
 - <https://github.com/python/typeshed>

Strategy

- Always run checker in the same way
 - Pin checker & version
 - Freeze options & config
- Start checking code as is
 - I.e. check top-level declarations only
- Add type annotations
 - Start small (only critical & new code at first)
 - mypy: `check_untyped_defs = True` ?

Strategy II

- Concentrate on callables
- Annotate variables only if asked to
- Think carefully before using Union/Optional
 - You have to check them for None

Get Some Help

- Add type annotations automatically
 - Mypy's stubgen (static)
 - MonkeyType (runtime)
 - PyAnnotate (runtime)
 - pytype (static)