

## OUTLINE

- About Python

## OUTLINE

- About Python
- Python is slow !

## OUTLINE

- About Python
- Python is slow !
- Profiling a Python code

## ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)

# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple

# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple
- Python is fully featured

# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple
- Python is fully featured
- Python is readable

# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple
- Python is fully featured
- Python is readable
- Python is extensible



# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple
- Python is fully featured
- Python is readable
- Python is extensible
- Python is ubiquitous, portable, and free

# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple
- Python is fully featured
- Python is readable
- Python is extensible
- Python is ubiquitous, portable, and free
- Python has many third party libraries, tools, and a large community

# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple
- Python is fully featured
- Python is readable
- Python is extensible
- Python is ubiquitous, portable, and free
- Python has many third party libraries, tools, and a large community

➡ But Python is slow!!

# ABOUT PYTHON

- Python was created by Guido van Rossum in 1991 (last version 3.11 – 24/10/2022)
- Python is simple
- Python is fully featured
- Python is readable
- Python is extensible
- Python is ubiquitous, portable, and free
- Python has many third party libraries, tools, and a large community

➡ When does it really matter?

# PYTHON IS SLOW

## **When does it matter?**

- Is my code fast?

# PYTHON IS SLOW

## **When does it matter?**

- Is my code fast?
- How many CPUh?

# PYTHON IS SLOW

## **When does it matter?**

- Is my code fast?
- How many CPUh?
- Problems on the system?

# PYTHON IS SLOW

## **When does it matter?**

- Is my code fast?
- How many CPUh?
- Problems on the system?
- How much effort is it to make it run faster?



## PROFILING A PYTHON CODE: WHY?

- Code bottlenecks

## 🔵 PROFILING A PYTHON CODE: WHY?

- Code bottlenecks
- Premature optimization is the root of all evil D. Knuth

# PROFILING A PYTHON CODE: WHY?

- Code bottlenecks
- Premature optimization is the root of all evil D. Knuth
- First make it work. Then make it right. Then make it fast. K. Beck

# 🔵 PROFILING A PYTHON CODE: WHY?

- Code bottlenecks
- Premature optimization is the root of all evil D. Knuth
- First make it work. Then make it right. Then make it fast. K. Beck
- How?

## 🔵 PROFILING A PYTHON CODE: PROFILERS

- Deterministic and statistical profiling

## PROFILING A PYTHON CODE: PROFILERS

- Deterministic and statistical profiling
  - the profiler will be monitoring all the events

## PROFILING A PYTHON CODE: PROFILERS

- Deterministic and statistical profiling
  - the profiler will be monitoring all the events
  - it will sample after time intervals to collect that information

## ❏ PROFILING A PYTHON CODE: PROFILERS

- Deterministic and statistical profiling
  - the profiler will be monitoring all the events
  - it will sample after time intervals to collect that information
- The level at which resources are measured; module, function or line level



# PROFILING A PYTHON CODE: PROFILERS

- Deterministic and statistical profiling
  - the profiler will be monitoring all the events
  - it will sample after time intervals to collect that information
- The level at which resources are measured; module, function or line level
- Profile viewers

## PROFILING A PYTHON CODE: TOOLS

- Inbuilt timing modules
- profile and cProfile
- pstats
- line\_profiler
- snakeviz

## PROFILING A PYTHON CODE: USE CASE

```
1 def linspace(start, stop, n):
2     step =float(stop -start) / (n -1)
3     return [start +i *step for i in range(n)]
4
5 def mandel(c, maxiter):
6     z = c
7     for n in range(maxiter):
8         if abs(z) >2:
9             return n
10        z = z*z +c
11    return n
12
13 def mandel_set(xmin=-2.0, xmax=0.5, ymin=-1.25, ymax=1.25,
14               width=1000, height=1000, maxiter=80):
15     r = linspace(xmin, xmax, width)
16     i = linspace(ymin, ymax, height)
17     n = [[0]*width for _ in range(height)]
18     for x in range(width):
19         for y in range(height):
20             n[y][x] =mandel(complex(r[x], i[y]), maxiter)
21    return n
```

# PROFILING A PYTHON CODE: TIMEIT

The very naive way

```
1 import timeit
2
3 start_time =timeit.default_timer()
4 mandel_set()
5 end_time =timeit.default_timer()
6 # Time taken in seconds
7 elapsed_time =end_time -start_time
8
9 print('> Elapsed time', elapsed_time)
```

or using the magic method timeit

```
1 [In] %timeit mandel_set()
2 [Out] 3.01 s +/- 84.6 ms per loop (mean +/- std. dev. of 7 runs, 1 loop each)
```

# PROFILING A PYTHON CODE: PRUN

```
[In] %prun -s cumulative mandel_set()
```

which is, in console mode, equivalent to

```
python -m cProfile -s cumulative mandel.py
```

```
25214601 function calls in 5.151 seconds
```

```
Ordered by: cumulative time
```

ncalls	totttime	percall	cumtime	percall	filename:lineno(function)
1	0.000	0.000	5.151	5.151	{built-in method builtins.exec}
1	0.002	0.002	5.151	5.151	<string>:1(<module>)
1	0.291	0.291	5.149	5.149	<ipython-input-4-9421bc2016cb>:13(mandel_set)
1000000	3.461	0.000	4.849	0.000	<ipython-input-4-9421bc2016cb>:5(mandel)
24214592	1.388	0.000	1.388	0.000	{built-in method builtins.abs}
1	0.008	0.008	0.008	0.008	<ipython-input-4-9421bc2016cb>:17(<listcomp>)
2	0.000	0.000	0.000	0.000	<ipython-input-4-9421bc2016cb>:1(linspace)
2	0.000	0.000	0.000	0.000	<ipython-input-4-9421bc2016cb>:3(<listcomp>)
1	0.000	0.000	0.000	0.000	{method 'disable' of '_lsprof.Profiler' objects}

# PROFILING A PYTHON CODE: LINE LEVEL

- Use the line\_profiler package

```
[In] %load_ext line_profiler
[In] %lprun -f mandel mandel_set()
```

```
Timer unit: 1e-06 s
Total time: 12.4456 s
File: <ipython-input-2-9421bc2016cb>
Function: mandel at line 5
#Line      Hits          Time  Per Hit   % Time  Line Contents
=====
5          5                0          0     0.0      def mandel(c, maxiter):
6      1000000      250304.0        0.3     1.1          z = c
7      24463110      6337732.0        0.3    27.7          for n in range(maxiter):
8      24214592      8327289.0        0.3    36.5              if abs(z) > 2:
9           751482       201108.0        0.3     0.9                  return n
10     23463110      7658255.0        0.3    33.5              z = z*z + c
11     248518         65444.0        0.3     0.3          return n
```

## PROFILING A PYTHON CODE: LINE LEVEL

This can be done in console mode as well

```
@profile
def mandel(c, maxiter):
    z = c
    for n in range(maxiter):
        if abs(z) > 2:
            return n
        z = z*z + c
    return n
```

Then on the command line

```
kernprof -l -v mandel.py
```

Then

```
python3 -m line_profiler mandel.py.lprof
```

# PROFILING A PYTHON CODE: MEMORY

- Use the `memory_profiler` package

```
[In] %load_ext memory_profiler
[In] %mprun -f mandel mandel_set()
```

Line #	Mem usage	Increment	Occurrences	Line Contents
8	118.2 MiB	-39057.7 MiB	1000000	def mandel(c, maxiter):
9	118.2 MiB	-39175.5 MiB	1000000	z = c
10	118.2 MiB	-293081.8 MiB	24463110	for n in range(maxiter):
11	118.2 MiB	-292425.7 MiB	24214592	if abs(z) > 2:
12	118.2 MiB	-38519.6 MiB	751482	return n
13	118.2 MiB	-253906.1 MiB	23463110	z = z*z + c
14	118.2 MiB	-656.4 MiB	248518	return n



## PROFILING A PYTHON CODE: MEMORY

- Use the `memory_profiler` package

```
@profile
def mandel(c, maxiter):
    z = c
    for n in range(maxiter):
        if abs(z) > 2:
            return n
        z = z*z + c
    return n
```

Then on the command line

```
mprof run mandel.py
```

Then

```
mprof plot
```

Or

```
python3 -m memory_profiler mandel.py
```