# Parallelism in Python

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#### **About Me**

- Final year CS student
- Using python for the last 3 years.
- Student Researcher at Next Tech Lab

#### Overview

- Python has enjoyed a decade of usage in industry and academia.
- Popular abstractions to scientific computing, AI/ML, etc.
- Yet, has a bad rep for its parallel processing capabilities.

### Is multi-threading a scam in Python?



#### How the interpreter works

```
>>> import sys
>>> a = []
>>> b = a
>>> sys.getrefcount(a)
Source: Real Python
```

Python uses reference counting for memory management.

The reference count variable needs protection from race conditions.

#### How the interpreter works

This count variable can be kept safe by adding locks to all data structures.

But, adding a lock to each object means multiple locks resulting in deadlocks/dec in performance.

#### Global Interpreter Lock (GIL)

- A mutex (or a lock).
- Allows only one thread to hold the control of the Python interpreter.

# Impact of GIL on multi-threaded programs

```
COUNT = 500000000

def countdown(n):
    while n>0:
        n -= 1

countdown(COUNT)

Source: Real Python
```

Single thread ~ 3.60 secs

# Impact of GIL on multi-threaded programs

```
COUNT = 50000000

def countdown(n):
    while n>0:
        n -= 1

t1 = Thread(target=countdown, args=(COUNT//2,))
t2 = Thread(target=countdown, args=(COUNT//2,))
Source: Real Python
```

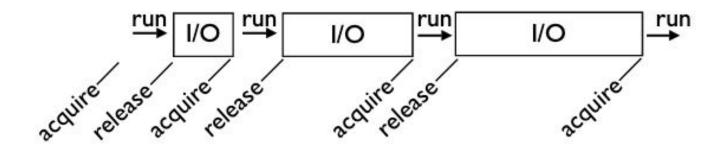
Multiple threads ~ 3.66 secs

(Overhead)

#### When is GIL not a problem?

<u>I/O Bound Tasks</u>: Everything that blocks the current thread while not consuming much CPU.

#### I/O Bound Tasks:



Source: David Beazely slides

#### When it is a problem?

<u>CPU Bound Tasks</u>: Tasks that mostly consume CPU time, like heavy computations or moving lots of data around in-memory (sorting, shuffling)

### Basically,

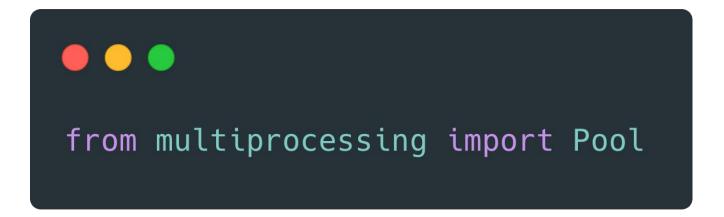


So, is it possible to inject parallelism in CPU bound tasks?

#### Introducing: Multi-Processing

Each Python process gets its own Python interpreter and memory space so the GIL won't be a problem.

#### Introducing: Multi-Processing



Thumbnailing thousands of images.

A common CPU bound task for someone working on vision, image processing, etc.

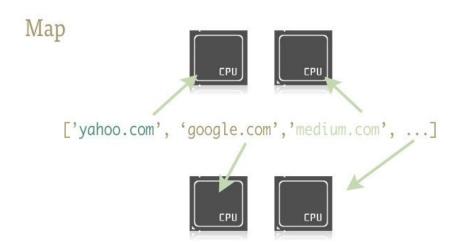
```
for image in images:
   create_thumbnail(image)
```

~27.9 seconds to process 6000 Images

```
pool = Pool() #default: no. of cores in the system
results = pool.map(create_thumbnail, images)
pool.close()
pool.join()
```

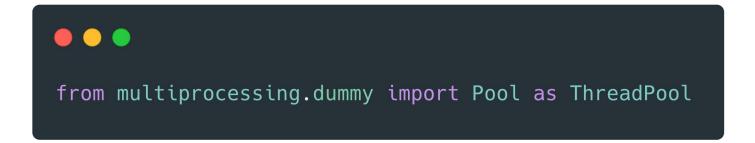
~**5.6** seconds!

#### How Map works?



### Bonus.....

# Injecting parallelism in IO bound programs



Retrieving multiple web pages using urlopen().

```
pool = ThreadPool(4)
results = pool.map(urllib2.urlopen, urls)
pool.close()
pool.join()
```

#### Real Life Example: 15 URLs

```
Single thread: 14.4 Seconds
4 Pool: 3.1 Seconds
8 Pool: 1.4 Seconds
13 Pool: 1.3 Seconds
```

"There's more than one way to do it"

Feel free to reach out!

#### Thank You!



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