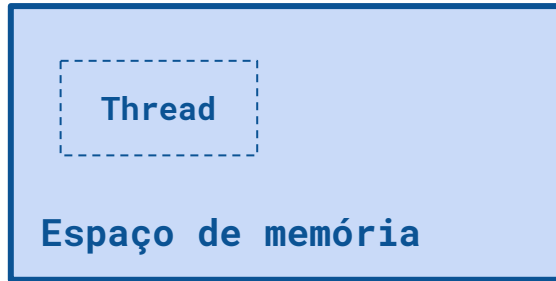
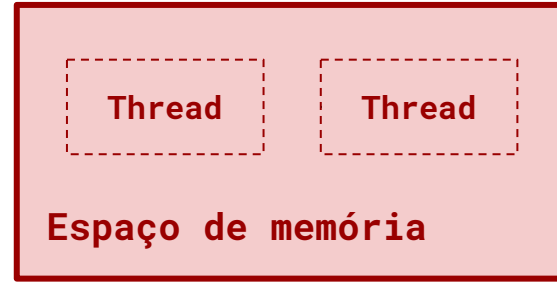
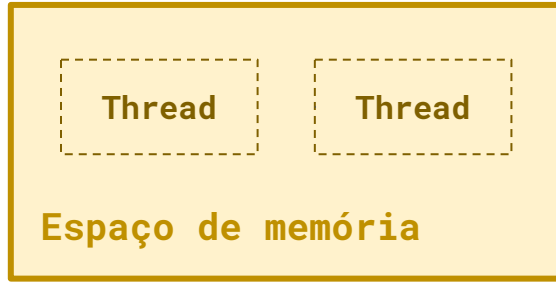


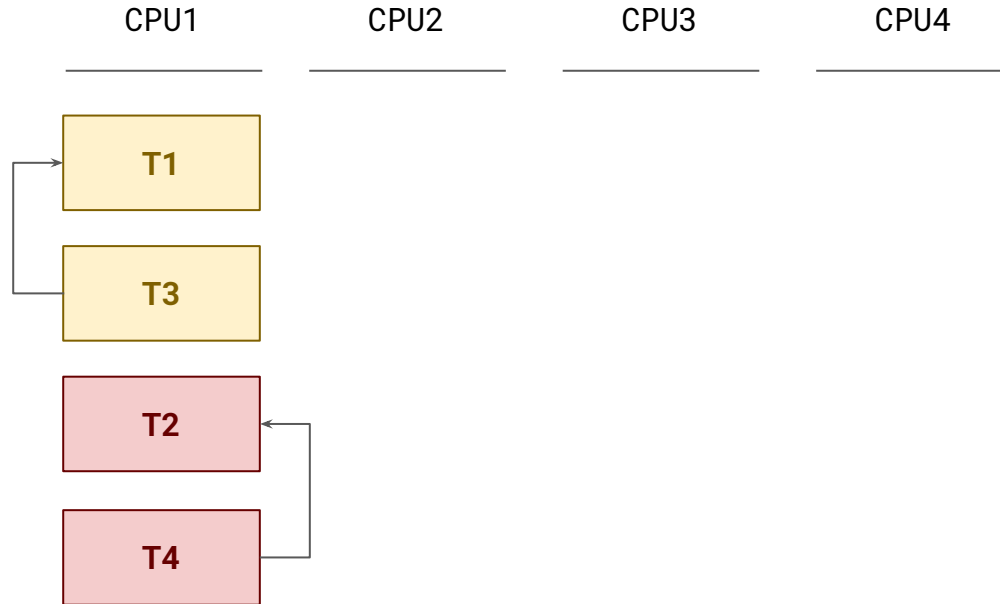
Paralelismo e Python

`juliana.oro@gmail.com`

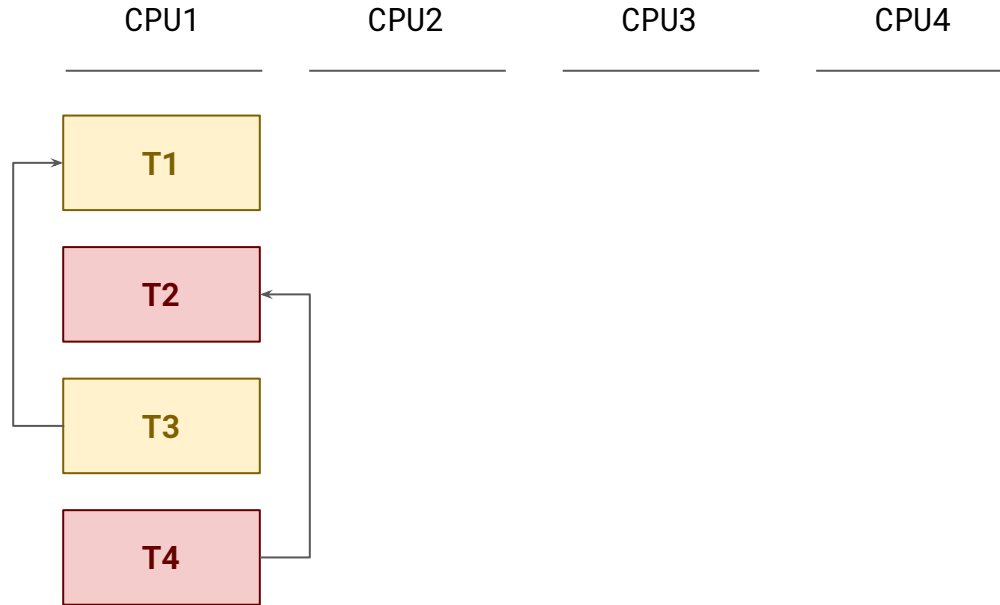
Threads e Processos



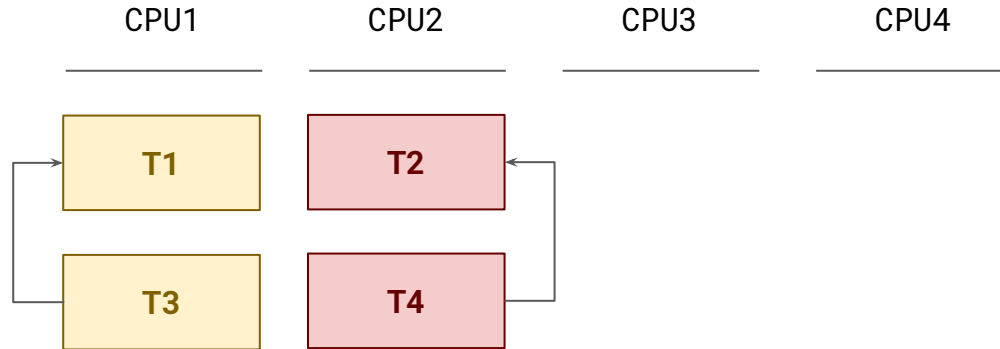
Paralelismo ou Concorrência



Paralelismo ou Concorrência



Paralelismo ou Concorrência



Paralelismo ou Concorrência



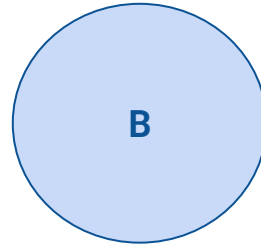
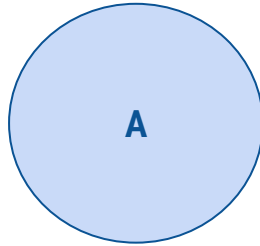
Locks e Deadlocks

Thread 1

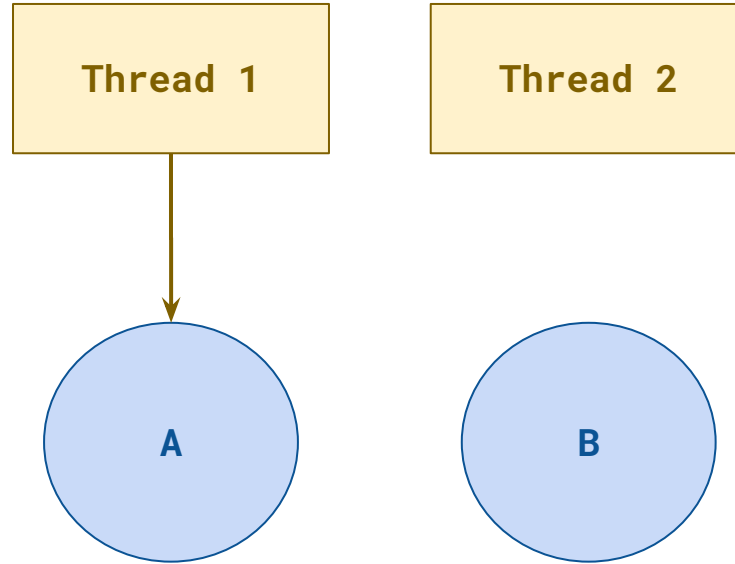
Thread 2

A

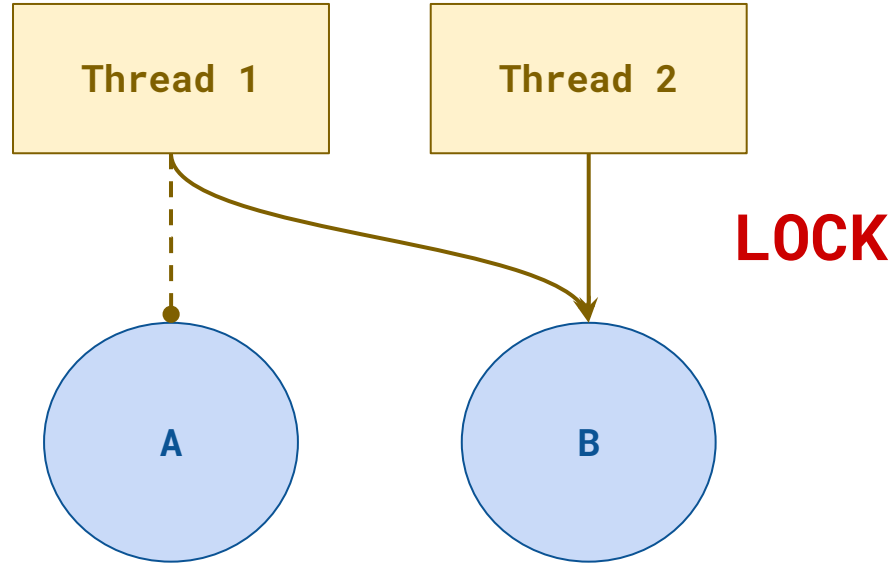
B



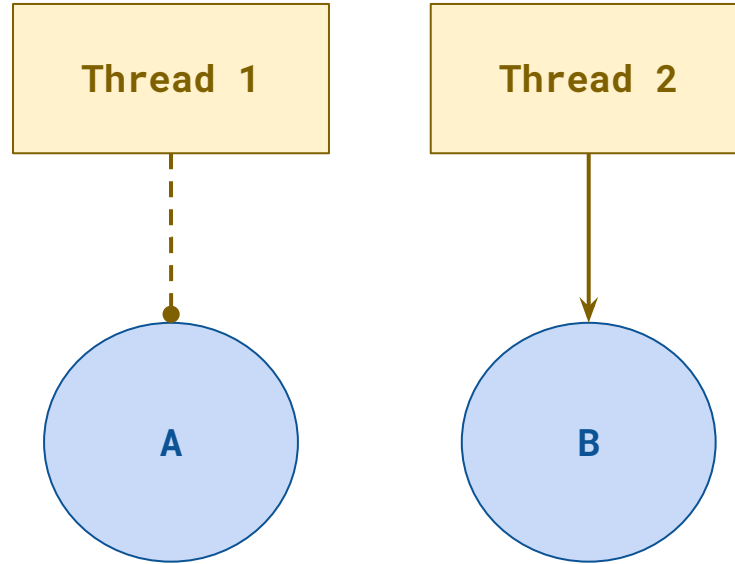
Locks e Deadlocks



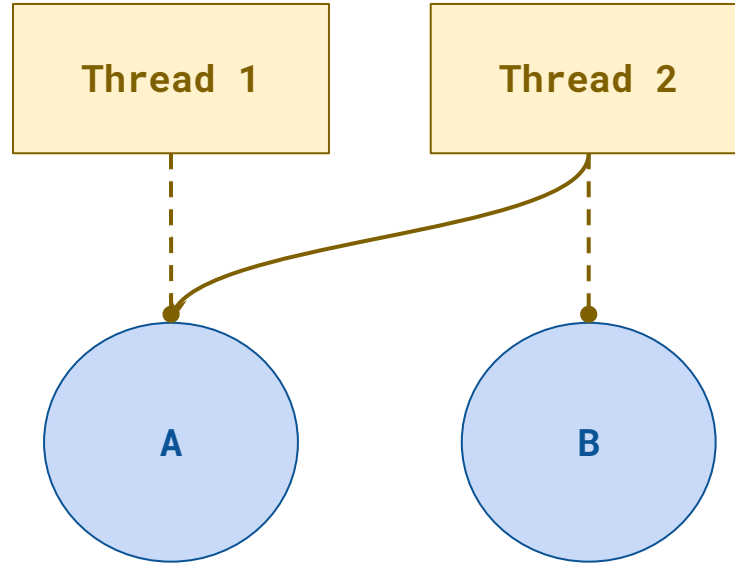
Locks e Deadlocks



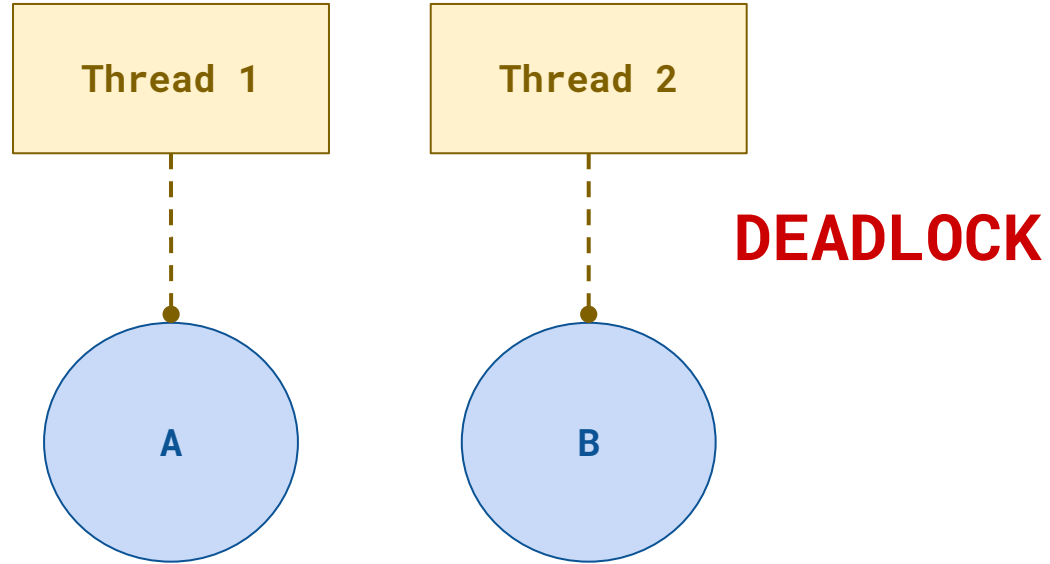
Locks e Deadlocks



Locks e Deadlocks

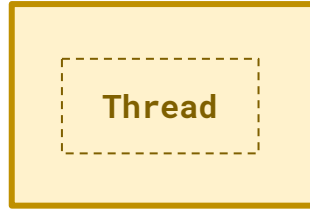


Locks e Deadlocks



```
curl -s 0.0.0.0:5000/hello  
{ "hello world!" }
```

```
app.run()
```



```
curl -s 0.0.0.0:5000/hello  
{ "hello world!" }
```

```
app.run(threaded=True)
```

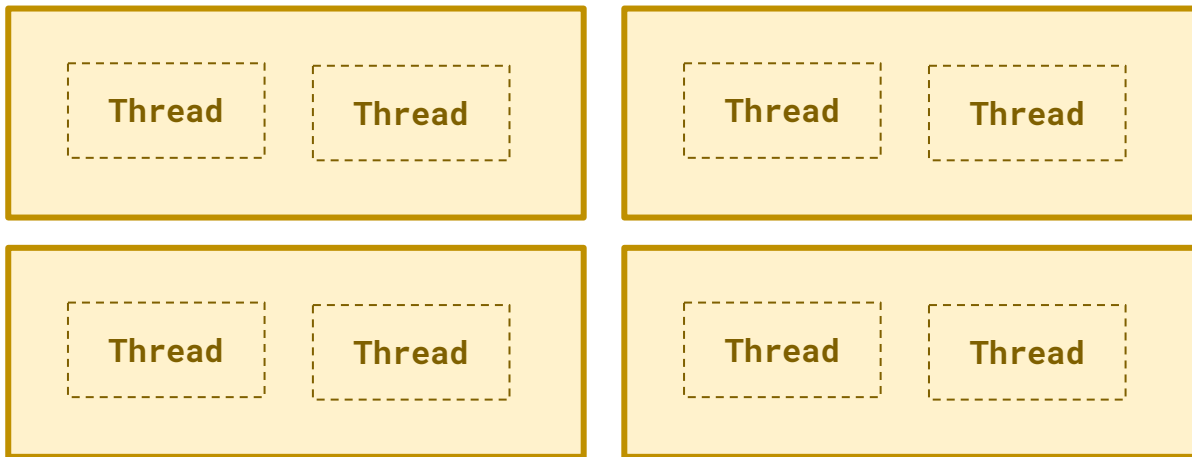
Thread

Thread

Thread

```
curl -s 0.0.0.0:5000/hello  
{ "hello world!" }
```

```
gunicorn server:app -w 4 --threads 2
```



Voltando aos anos 90

CPU

Voltando aos anos 90

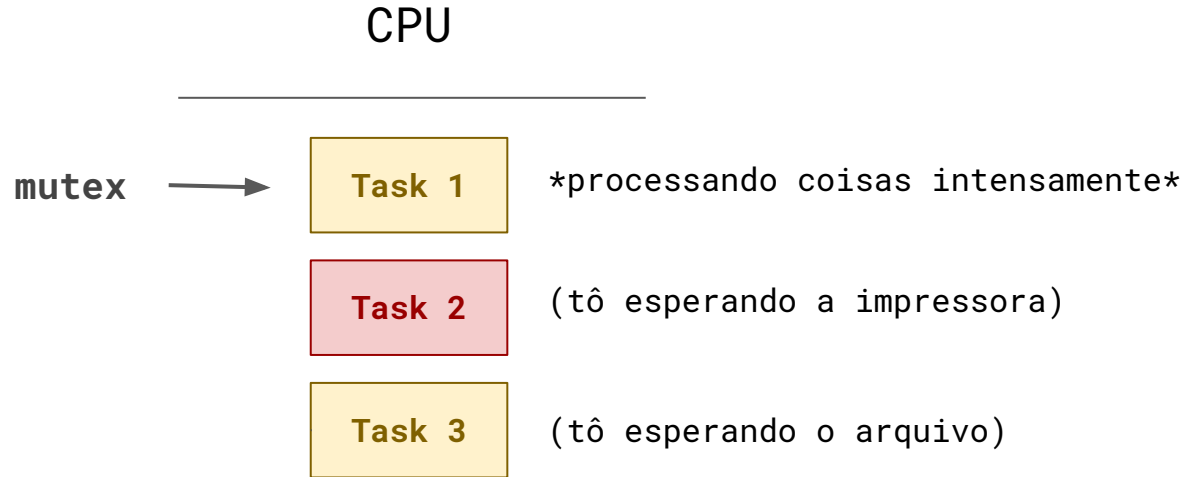
CPU

Task 1

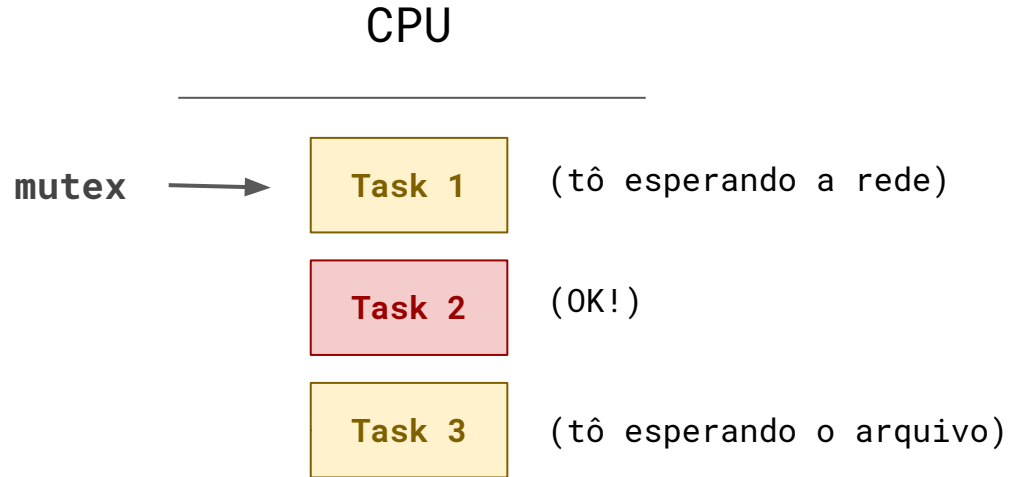
Task 2

Task 3

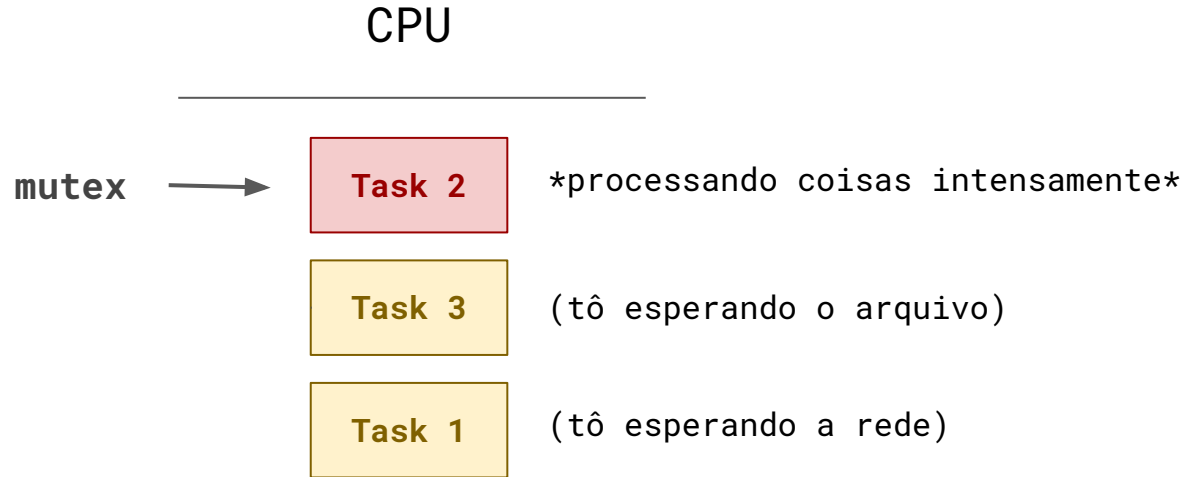
Voltando aos anos 90



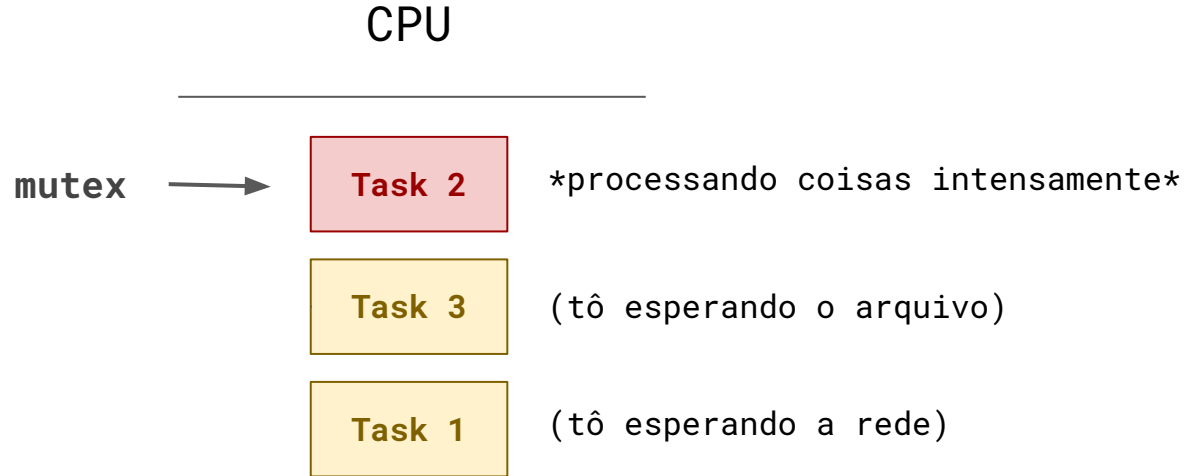
Voltando aos anos 90



Voltando aos anos 90



Voltando aos anos 90



**{COOPERATIVE, PREEMPTIVE}
MULTITASKING**

Python roda em cima de
um interpretador

Uma thread roda Python,
enquanto N dormem ou esperam
I/O

Python roda em cima de
um interpretador

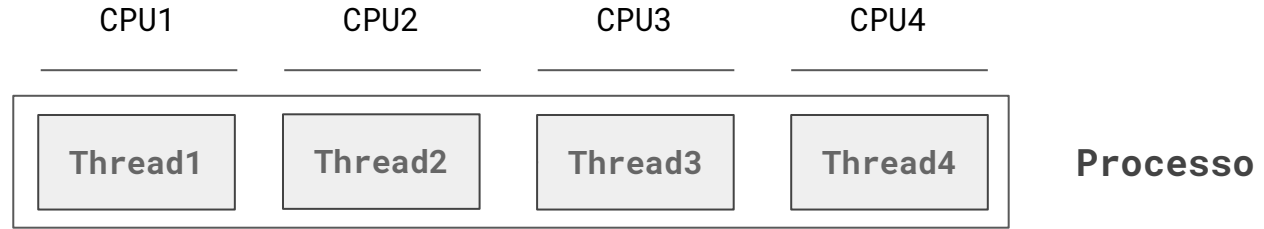
Uma thread roda Python,
enquanto N dormem ou esperam
I/O

**GLOBAL INTERPRETER LOCK
(GIL)**

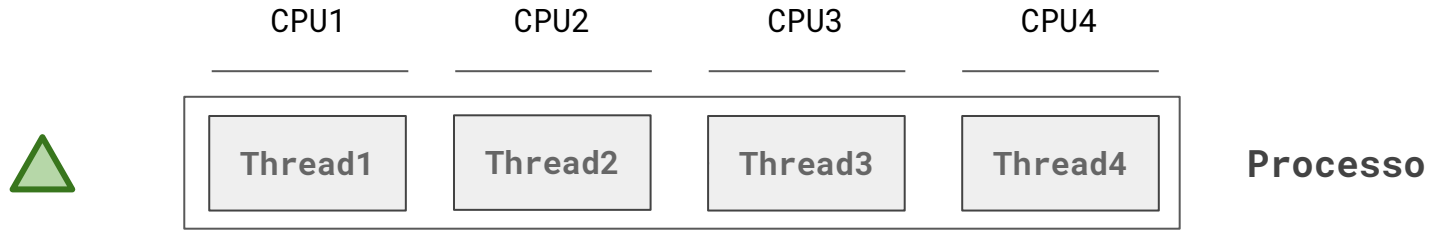
Python roda em cima de um interpretador... em C

```
#include "pthread.h"
#define ENTER_HASHLIB(obj) \
    if ((obj)->lock) { \
        if (!PyThread_acquire_lock((obj)->lock, 0)) { \
            Py_BEGIN_ALLOW_THREADS \
            PyThread_acquire_lock((obj)->lock, 1); \
            Py_END_ALLOW_THREADS \
        } \
    }
#define LEAVE_HASHLIB(obj) \
    if ((obj)->lock) { \
        PyThread_release_lock((obj)->lock); \
    }
```

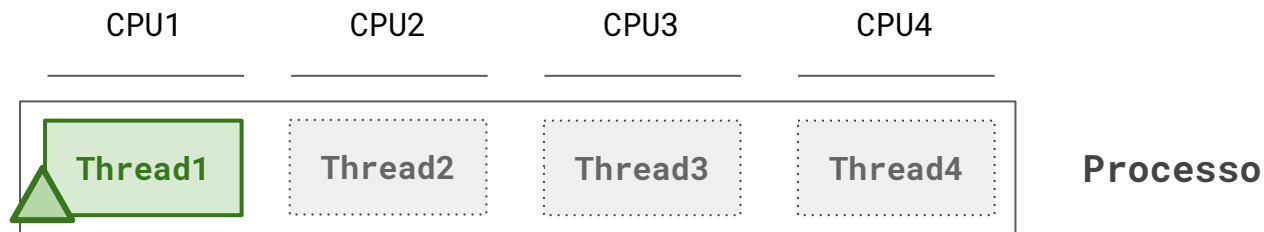

Trazendo isso pra hoje



Trazendo isso pra hoje



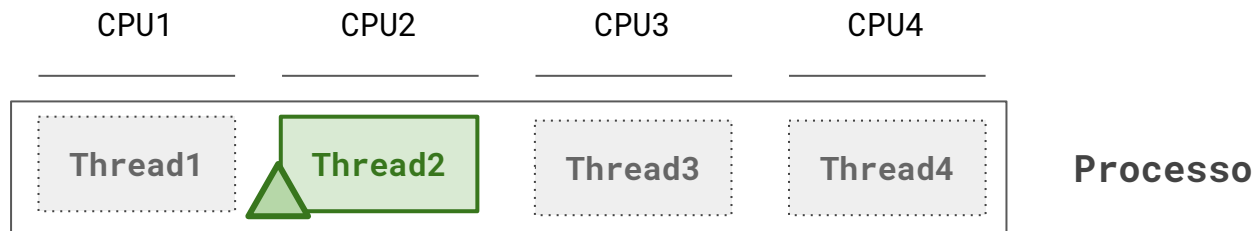
Trazendo isso pra hoje



A cada 100 instruções o
interpretador...

1. Trava o mutex
2. Sinaliza isso através de uma variável, que as outras threads estão sempre lendo.
3. Por conta das outras threads estarem sempre esperando a vez delas, syscalls adicionais são usadas pra mandar sinais pra elas.

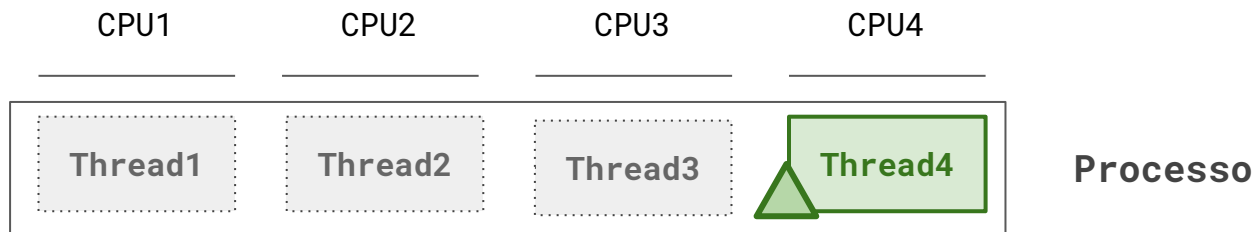
Trazendo isso pra hoje



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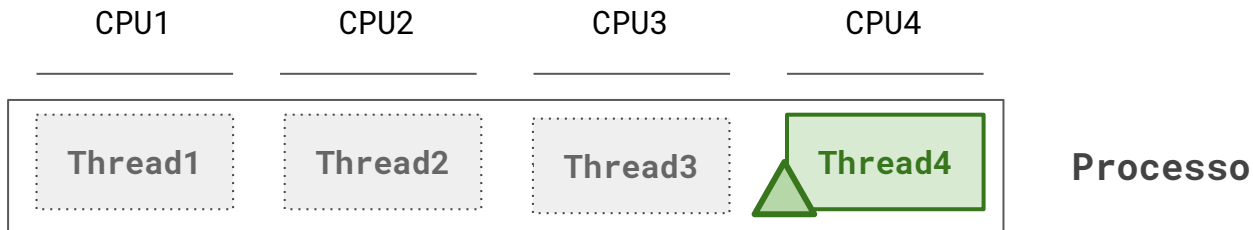
Trazendo isso pra hoje



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Trazendo isso pra hoje

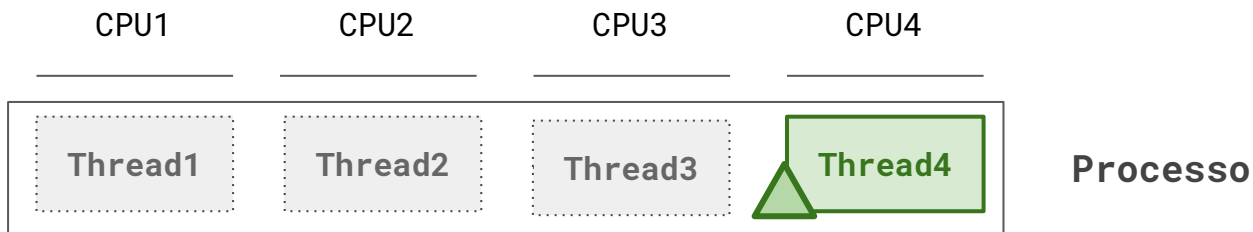


A cada 100 instruções o
interpretador...

1. Trava o mutex
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3. Por conta das outras threads estarem sempre esperando a vez delas, syscalls adicionais são usadas pra mandar sinais pra elas.

```
while thread.locked:  
    thread.wait()
```

Trazendo isso pra hoje



```
def count(n):  
    while n > 0:  
        n -= 1
```

Sequential Execution (OS-X, 1 CPU)

736 Unix system calls
117 Mach System Calls

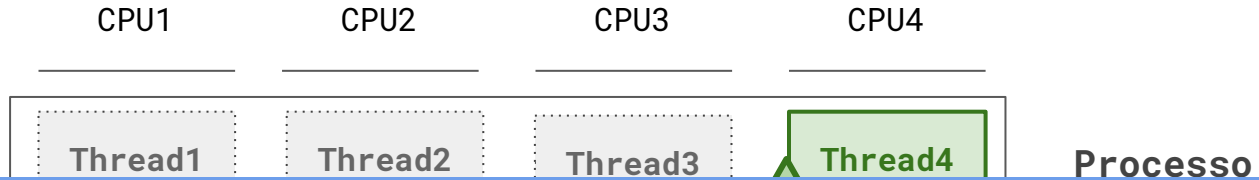
count(100000000)

Two CPU-bound threads (OS-X, 1 CPU)

1149 Unix system calls
~ **3.3 Million** Mach System Calls

-x1.8

Trazendo isso pra hoje



Como resolver essa treta?

```
while n > 0:  
    n -= 1
```

117 Mach System Calls

```
count(100000000)
```

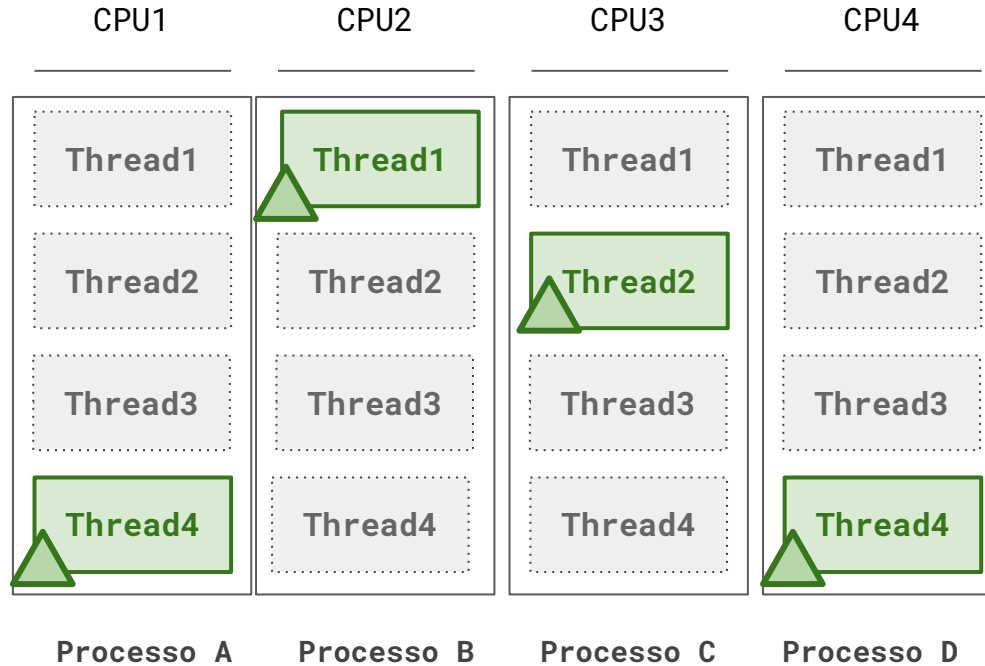
Two CPU-bound threads (OS-X, 1 CPU)

1149 Unix system calls

~ 3.3 Million Mach System Calls

-x1.8

Multiprocessing

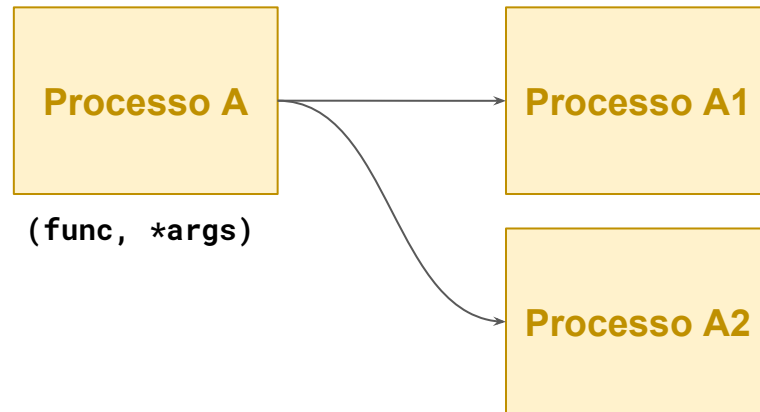


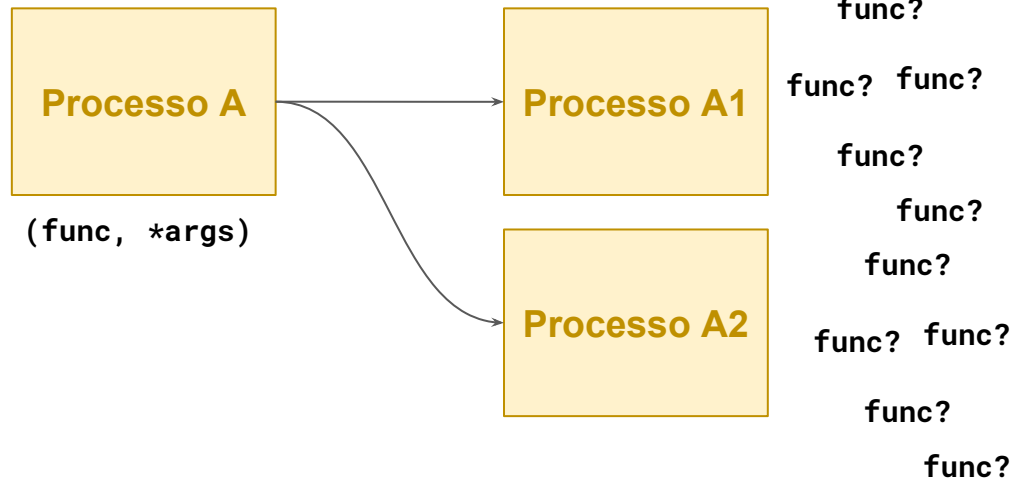
Multiprocessing

< comparação >

Processo A

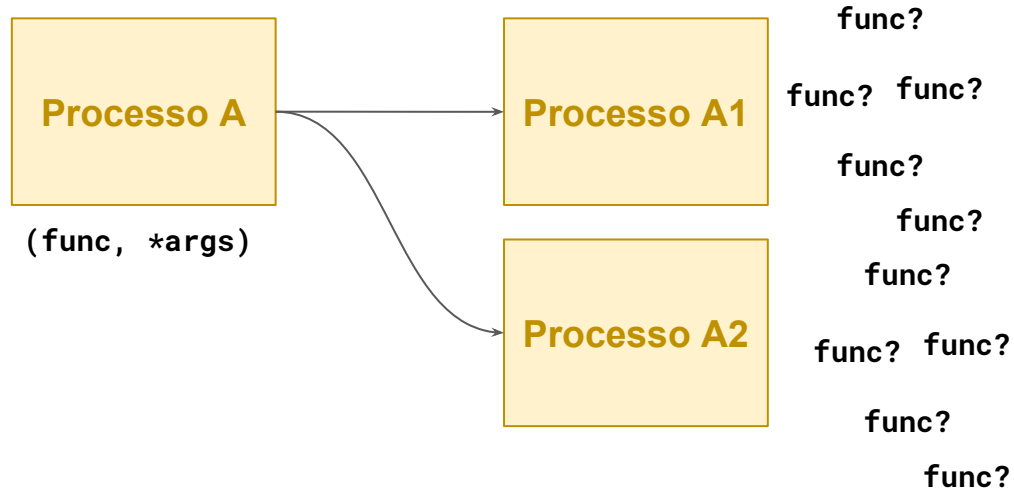
(func, *args)





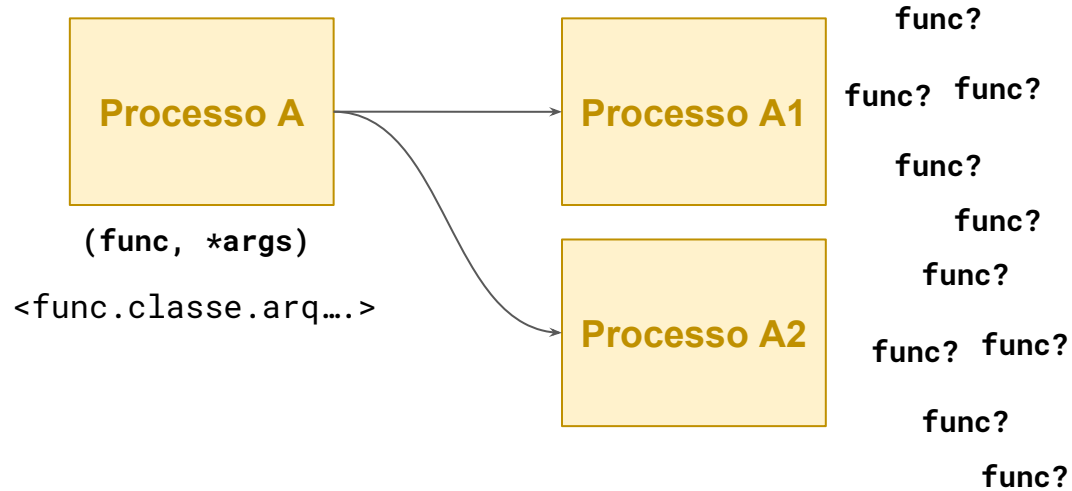
Serialização

Pickle



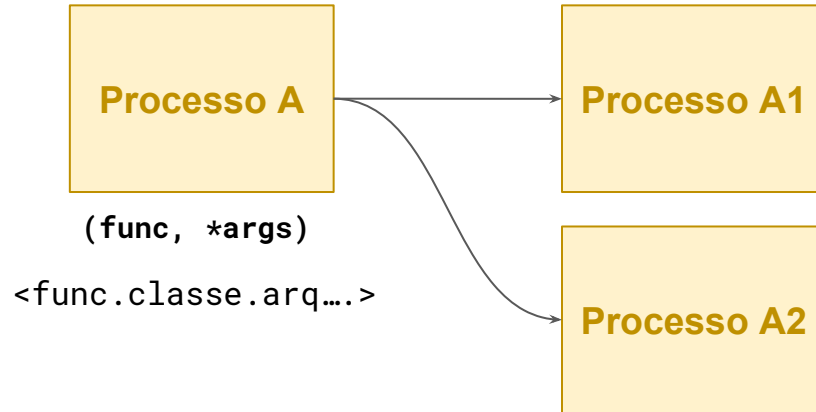
Serialização

Pickle



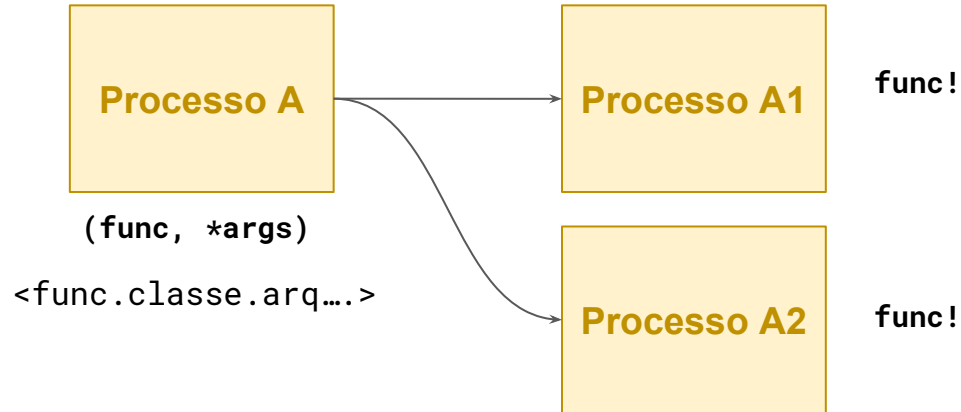
Serialização

Pickle



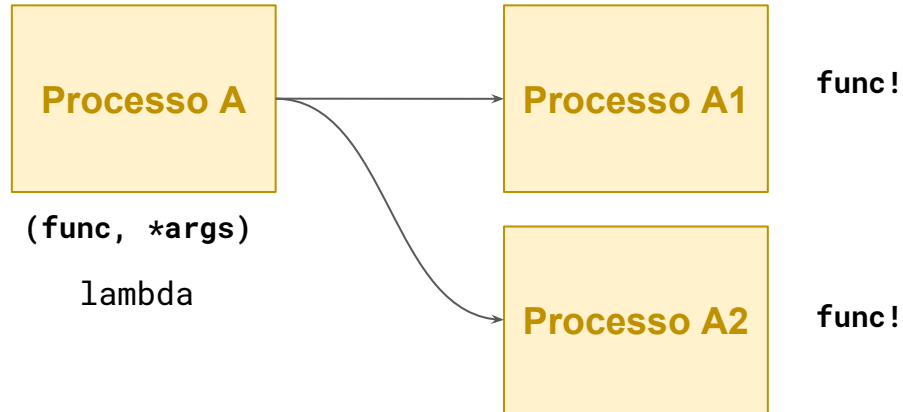
Serialização

Pickle



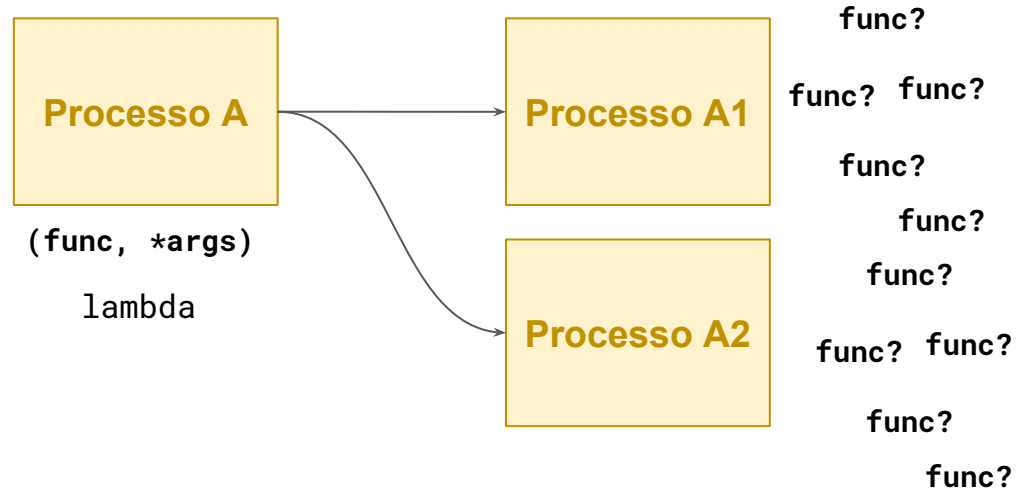
Serialização

Pickle



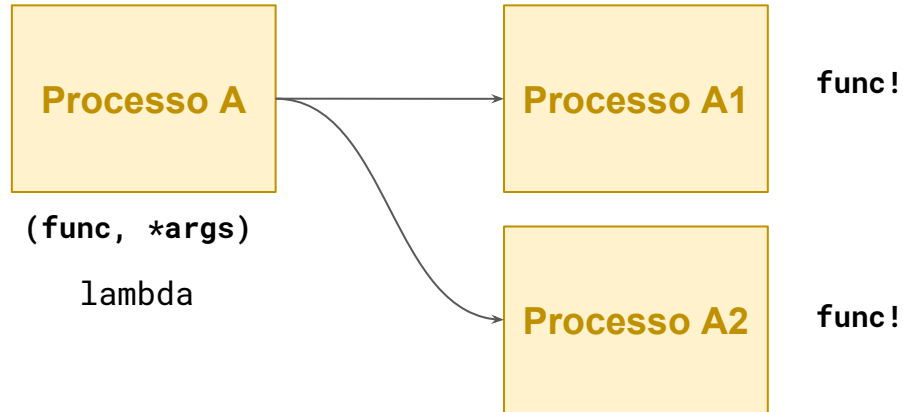
Serialização

Pickle



Serialização

DILL



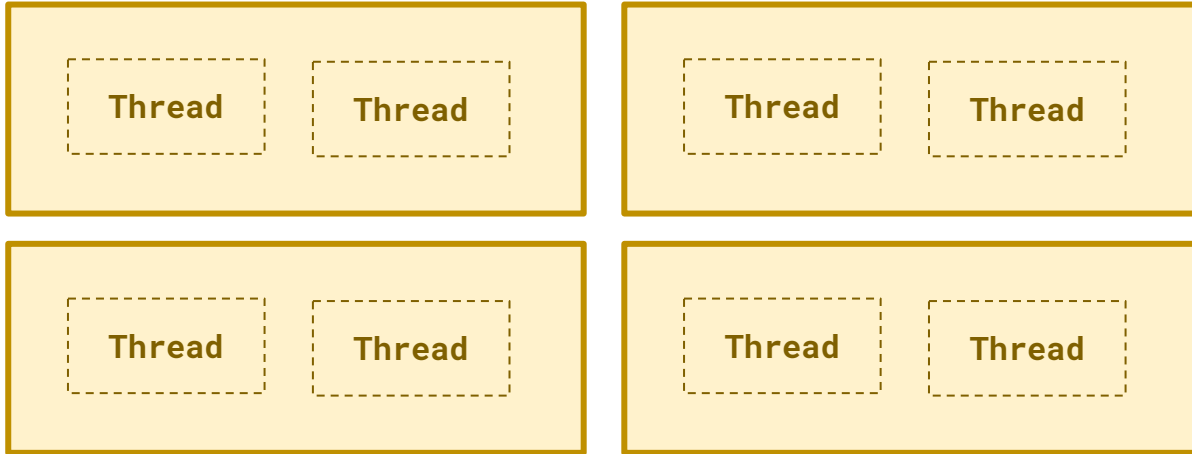
Multiprocessing

PATHOS: Dill + Multiprocessing

a framework for parallel graph management
and execution in heterogeneous computing

```
curl -s 0.0.0.0:5000/hello  
{ "hello world!" }
```

```
gunicorn server:app -w 4 --threads 2
```



```
curl -s 0.0.0.0:5000/hello/4  
{ 'hello ' + prime(4) }
```

```
gunicorn server:app -w 1 --threads 4
```

Thread

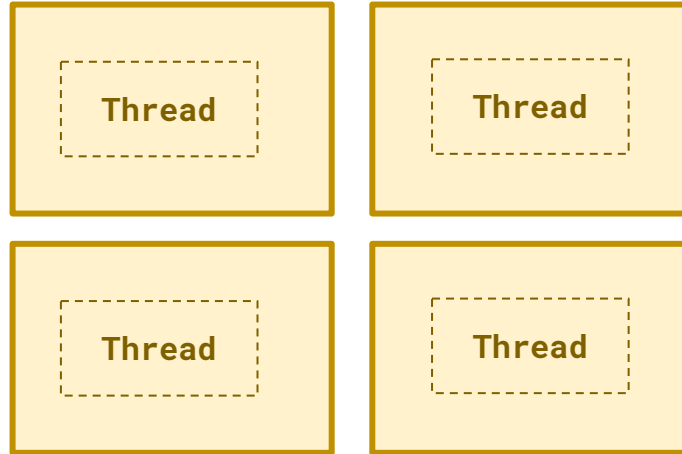
Thread

Thread

Thread

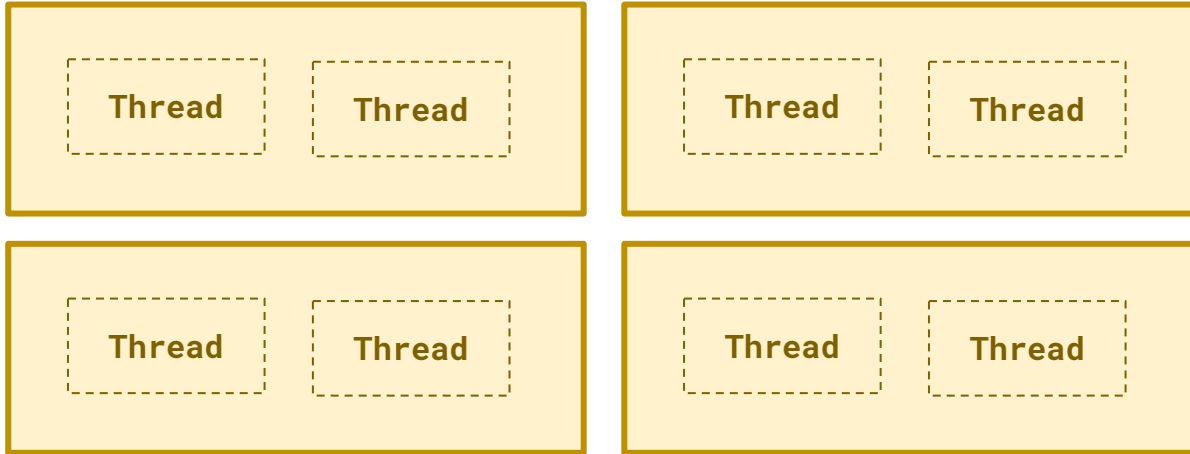
```
curl -s 0.0.0.0:5000/hello/4  
{ 'hello ' + prime(4) }
```

```
gunicorn server:app -w 4 --threads 1
```




```
curl -s 0.0.0.0:5000/hello/4  
{ 'hello ' + prime(4) }
```

```
gunicorn server:app -w 4 --threads 2
```



Perguntas?