



# **Alta Performance com Python**

Paralelismo e Concorrência



**Python Cerrado**  
Brasília 2018

# Alta Performance com Python

Paralelismo e Concorrência

## Bruno Barbosa

**Desenvolvedor de Software na Globo.com**

Brasiliense se aventurando pelo errejota :)

Programador por diversão há 14 anos

Há 7 anos escrevendo software profissionalmente

Apaixonado por Python e todo seu ecossistema

Iniciou sua carreira trabalhando com Python, Zope e Plone

Trabalhando atualmente na maior parte do tempo com Python, Go e JavaScript.



# globo .com



**Mais de**  
**50 milhões**  
**de visitas por dia**

# Homes da **Globo.com**

The image shows three separate mobile device screens, each displaying a different section of the Globo.com website:

- Top Screen (Orange Header):** Shows a large image of a man's face, a smaller image of a woman, and a news snippet about Galdino.
- Middle Screen (Green Header):** Shows a live soccer match between Bahia and Fluminense, with a score of 1x0.
- Bottom Screen (Red Header):** Features a headline about presidential candidates traveling over 200,000 km, a live soccer match between Ceará and Palmeiras, and a poll asking "Who did you choose?"

# Processos e Threads

# Processos e Threads

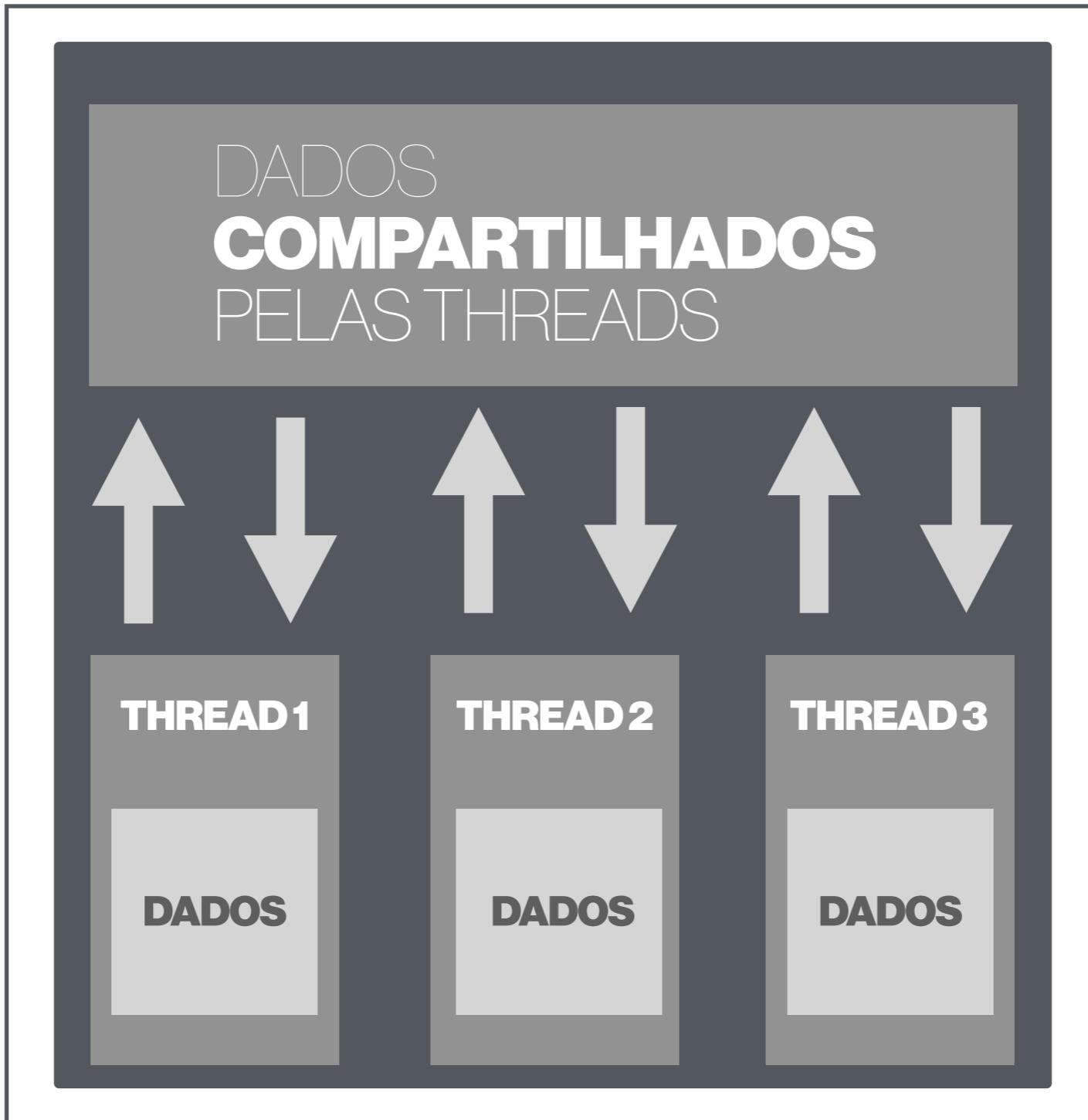
## Comparativo

	<b>Processos</b>	<b>Threads</b>
<b>Compartilham memória</b>		
<b>Custo de spawn/switch</b>		
<b>Necessidade de recursos</b>		
<b>Mecanismos de sincronização</b>		

# Processos e Threads

Anatomia de um processo

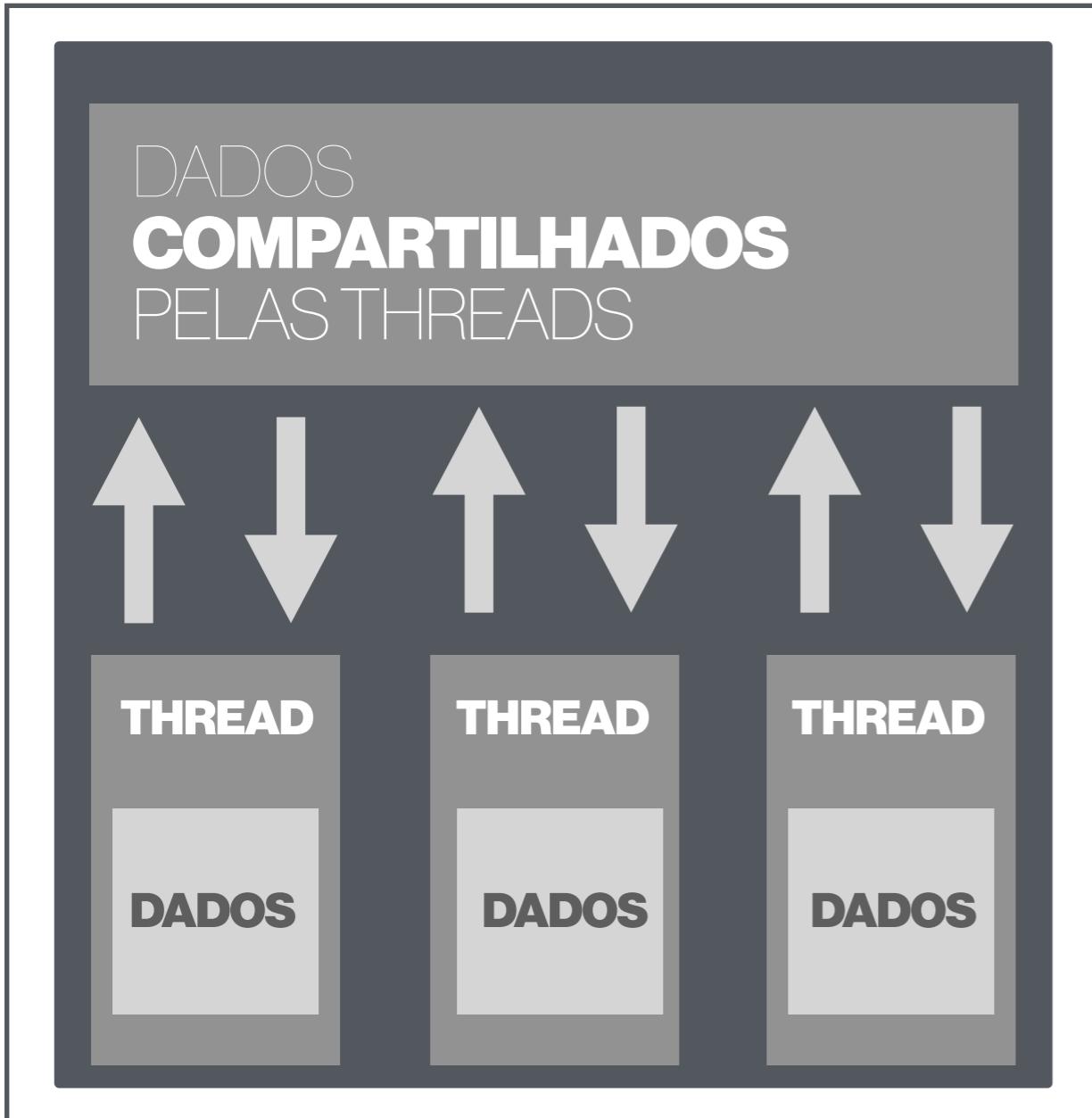
## PROCESSO 1



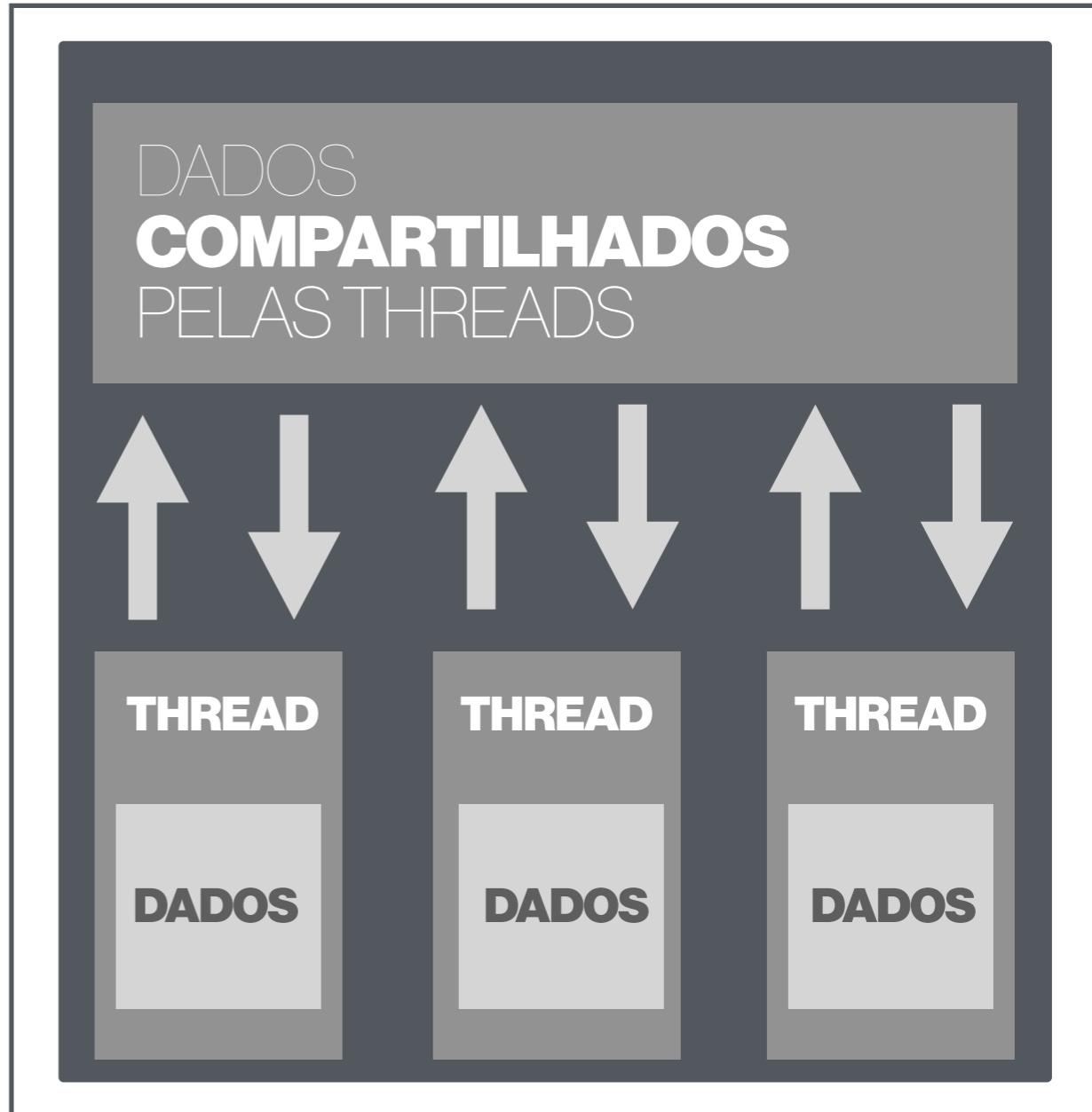
# Processos e Threads

Anatomia de um processo

## PROCESSO 1



## PROCESSO 2



# Processos e Threads

Tipos de processos

---

**CPU BOUND**

e

**I/O BOUND**

# Processos e Threads

Tipos de processos

## CPU BOUND

Computações matemáticas intensas

Algoritmos de busca e ordenação em memória

Processamento e reconhecimento de imagem

✓ Paralelismo

## I/O BOUND

Transferência de dados pela rede

Escrita de arquivo em disco

Consulta a uma API HTTP

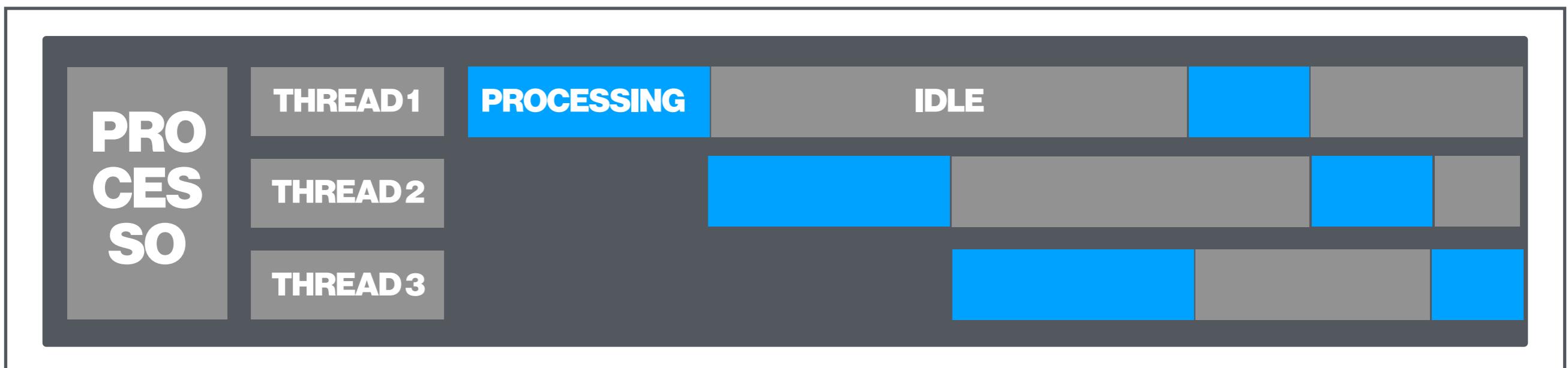
✓ Concorrência

# Concorrência e Paralelismo

Como funciona

## CONCORRÊNCIA

CPU

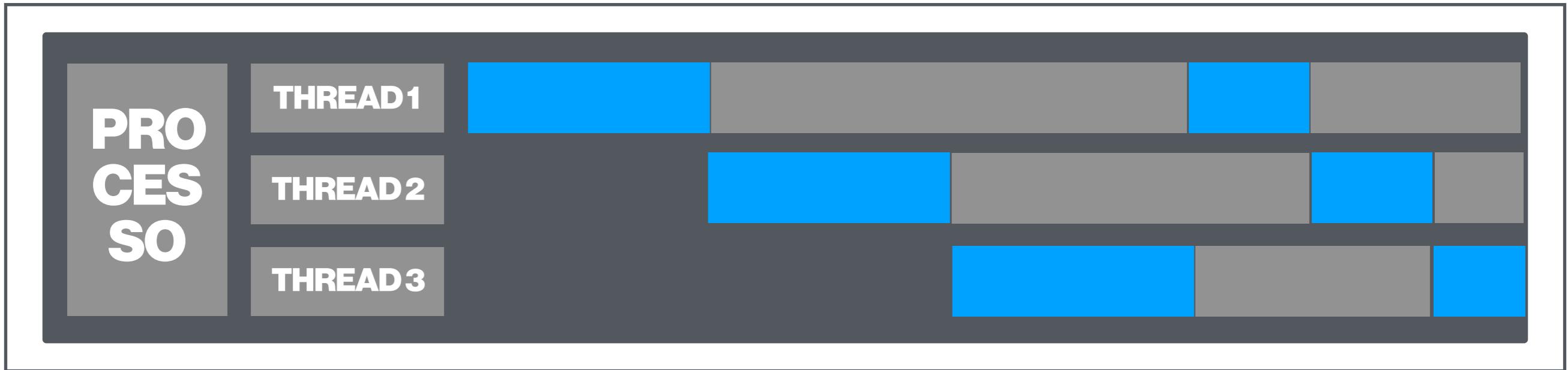


# Concorrência e Paralelismo

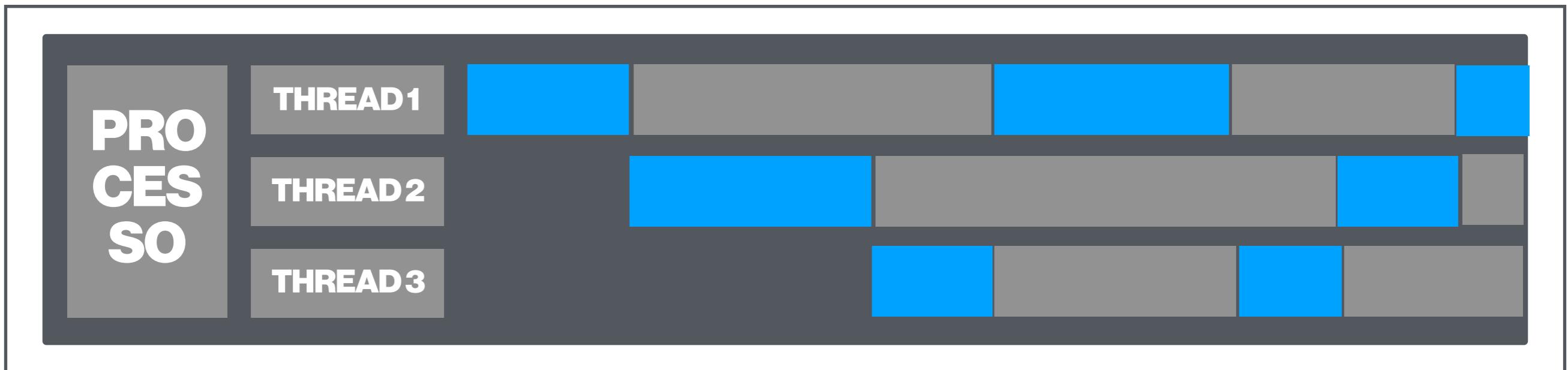
Como funciona

## PARALELISMO

CPU



CPU



VAMOS FALAR DE  
**PYTHON**

O famigerado **GIL**  
*(Global Interpreter Lock)*

{ the <sup>SHOW ME</sup> Code }

# I/O Bound

Simulando uma atividade de rede

---

```
import multiprocessing
import os
import threading
import time

MAX_WORKERS = 4

def io_expensive(sleep_time=1):
    """ Do nothing, wait for a timer to expire """
    print("PID: {}, Process Name: {}, Thread Name: {}".format(
        os.getpid(),
        multiprocessing.current_process().name,
        threading.current_thread().name)
    )
    time.sleep(sleep_time)
```

# I/O Bound

Simulando uma atividade de rede

---

## 1º Teste: Sequencial

```
import time
from main_example import MAX_WORKERS, io_expensive

start_time = time.time()
for i in range(MAX_WORKERS):
    io_expensive(i)
end_time = time.time()

print("\n✓ Serial time=", end_time - start_time)
```

# I/O Bound

Simulando uma atividade de rede

## 2º Teste: Threads

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, io_expensive

start_time = time.time()
with futures.ThreadPoolExecutor(MAX_WORKERS) as executor:
    executor.map(io_expensive, range(MAX_WORKERS))
end_time = time.time()

print("\n✓ Threads time=", end_time - start_time)
```

# I/O Bound

Simulando uma atividade de rede

---

## 2º Teste: Threads

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, io_expensive

start_time = time.time()

with futures.ThreadPoolExecutor(MAX_WORKERS) as executor:
    executor.map(io_expensive, range(MAX_WORKERS))

end_time = time.time()

print("\n✓ Threads time=", end_time - start_time)
```

---

# I/O Bound

Simulando uma atividade de rede

---

## 3º Teste: Processos

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, io_expensive

start_time = time.time()
with futures.ProcessPoolExecutor() as executor:
    executor.map(io_expensive, range(MAX_WORKERS))
end_time = time.time()

print("\n✓ Parallel time=", end_time - start_time)
```

# I/O Bound

Simulando uma atividade de rede

---

## 3º Teste: Processos

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, io_expensive

start_time = time.time()

with futures.ProcessPoolExecutor() as executor:
    executor.map(io_expensive, range(MAX_WORKERS))

end_time = time.time()

print("\n✓ Parallel time=", end_time - start_time)
```

---

# I/O Bound

Simulando uma atividade de rede

---

✓ Running I/O expensive tasks...

✓ Running tasks serially...

PID: 10326, Process Name: MainProcess, Thread Name: MainThread

✓ Serial time= 6.005445957183838

---

✓ Running tasks using threads...

PID: 10326, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_0

PID: 10326, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_0

PID: 10326, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_1

PID: 10326, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_2

✓ Threads time= 3.0051229000091553

---

✓ Running tasks using processes...

PID: 10329, Process Name: ForkProcess-1, Thread Name: MainThread

PID: 10330, Process Name: ForkProcess-2, Thread Name: MainThread

PID: 10329, Process Name: ForkProcess-1, Thread Name: MainThread

PID: 10331, Process Name: ForkProcess-3, Thread Name: MainThread

✓ Parallel time= 3.0507960319519043

---

# CPU Bound

Simulando uma atividade de alto processamento

---

```
import multiprocessing
import os
import threading
import time

MAX_WORKERS = 4

def cpu_expensive():
    """ Do some computations """
    print("PID: {}, Process Name: {}, Thread Name: {}".format(
        os.getpid(),
        multiprocessing.current_process().name,
        threading.current_thread().name)
    )
    x = 0
    while x < 10000000:
        x += 1
```

# CPU Bound

Simulando uma atividade de alto processamento

---

## 1º Teste: Sequencial

```
import time
from main_example import MAX_WORKERS, cpu_expensive

start_time = time.time()
for i in range(MAX_WORKERS):
    cpu_expensive()
end_time = time.time()

print("\n✓ Serial time=", end_time - start_time)
```

# CPU Bound

Simulando uma atividade de alto processamento

---

## 2º Teste: Threads

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, cpu_expensive

start_time = time.time()
with futures.ThreadPoolExecutor(MAX_WORKERS) as executor:
    for _ in range(MAX_WORKERS):
        executor.submit(cpu_expensive)
end_time = time.time()

print("\n✓ Threads time=", end_time - start_time)
```

# I/O Bound

Simulando uma atividade de rede

---

## 2º Teste: Threads

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, cpu_expensive

start_time = time.time()

with futures.ThreadPoolExecutor(MAX_WORKERS) as executor:
    for _ in range(MAX_WORKERS):
        executor.submit(cpu_expensive)

end_time = time.time()

print("\n✓ Threads time=", end_time - start_time)
```

---

# CPU Bound

Simulando uma atividade de alto processamento

---

## 3º Teste: Processos

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, io_expensive

start_time = time.time()
with futures.ProcessPoolExecutor() as executor:
    for _ in range(MAX_WORKERS):
        executor.submit(cpu_expensive)
end_time = time.time()

print("\n✓ Parallel time=", end_time - start_time)
```

# I/O Bound

Simulando uma atividade de rede

---

## 3º Teste: Processos

```
import time
from concurrent import futures

from main_example import MAX_WORKERS, io_expensive

start_time = time.time()

with futures.ProcessPoolExecutor() as executor:
    for _ in range(MAX_WORKERS):
        executor.submit(cpu_expensive)

end_time = time.time()

print("\n✓ Parallel time=", end_time - start_time)
```

---

# CPU Bound

Simulando uma atividade de alto processamento

---

• Running CPU expensive tasks...

✓ Running tasks serially...

PID: 11001, Process Name: MainProcess, Thread Name: MainThread

✓ Serial time= 3.126549005508423

---

✓ Running tasks using threads...

PID: 11001, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_0

PID: 11001, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_1

PID: 11001, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_2

PID: 11001, Process Name: MainProcess, Thread Name: ThreadPoolExecutor-0\_3

✓ Threads time= 3.0347580909729004

---

✓ Running tasks using processes...

PID: 11004, Process Name: ForkProcess-2, Thread Name: MainThread

PID: 11003, Process Name: ForkProcess-1, Thread Name: MainThread

PID: 11005, Process Name: ForkProcess-3, Thread Name: MainThread

PID: 11006, Process Name: ForkProcess-4, Thread Name: MainThread

✓ Parallel time= 1.7643580436706543

---

**PARA CASOS MAIS COMPLEXOS USE**

OS MÓDULOS

**THREADING** e

**MULTIPROCESSING**

E O TAL DO  
**ASYNC/AWAIT?**



# **GERADORES!!!**



# Generators

Producindo valores através de yield

```
def gen_integer():
    print("Calling for fist time ... ")
    → yield 1

    print("Calling for second time ... ")
    yield 2

    print("Calling for third time ... ")
    yield 3
```

```
>>> gen = gen_integer()
>>> next(gen)
Calling for fist time...
1
>>> next(gen)
Calling for second time...
2
>>> next(gen)
Calling for third time...
3
>>> next(gen)
Traceback (most recent call last):
...
StopIteration
```

# Generators

Producindo valores através de yield

```
def gen_fruit():
    fruits = ['apple', 'banana', 'grape']
    for fruit in fruits:
        yield fruit
```

```
>>> basket = gen_fruit()
>>> for fruit in basket:
    print(f"Got: {fruit}")
```

Got: apple

Got: banana

Got: grape

# Generators

Usando yield from

```
def gen_fruit():
    fruits = ['apple', 'banana', 'grappes']
    yield from fruits
    yield fruit
```

```
>>> basket = gen_fruit()
>>> for fruit in basket:
    print(f"Got: {fruit}")
```

Got: apple

Got: banana

Got: grape

# **Coroutines**

# Coroutines

Um gerador melhorado

```
def example_coro():
    print("→ Execution started")
    → x = yield
    print(f"→ Received value: {x}")
```

```
def main():
    → coro = example_coro()
    print("⇒ Preparing the coroutine ... ")
    next(coro)
    print("⇒ sending a value to coroutine: ")
    coro.send(42)
```

# Coroutines

Um gerador melhorado

```
    ➡ Preparing the coroutine...
    ➡ Execution started
    ➡ sending a value to coroutine:
    ➡ Received value: 42
Traceback (most recent call last):
...
StopIteration
```

# Coroutines

Um gerador melhorado

```
def example_coro_2(start_num):
    print("→ Example started!")
    → value = yield start_num

    print(f"→ Received: {value}")
    yield start_num + value
```

```
def example_2():
    → coro = example_coro_2(20)

initial_value = next(coro)
print(f"⇒ Initial value: {initial_value}")

v = coro.send(22)
print(f"⇒ sum: {v}")

next(coro)
```

# Coroutines

Um gerador melhorado

```
→ Example started!  
⇒ Initial value: 20  
→ Received: 22  
⇒ sum: 42  
Traceback (most recent call last):  
...  
StopIteration
```

# **ASYNC / AWAIT**

# ASYNC / AWAIT

Código assíncrono através de corrotinas

---

```
import asyncio
import time

@asyncio.coroutine
def say_after(delay, what):
    yield from asyncio.sleep(delay)
    print(what)

@asyncio.coroutine
def main():
    print('started at', time.strftime('%X'))

    yield from say_after(1, 'hello')
    yield from say_after(2, 'world')

    print('finished at', time.strftime('%X'))

asyncio.run(main())
```

# ASYNC / AWAIT

Código assíncrono através de corrotinas

---

```
import asyncio
import time

async def say_after(delay, what):
    await asyncio.sleep(delay)
    print(what)

async def main():
    print('started at', time.strftime('%X'))

    await say_after(1, 'hello')
    await say_after(2, 'world')

    print('finished at', time.strftime('%X'))

asyncio.run(main())
```

# ASYNC / AWAIT

Fazendo requisições HTTP com o método aiohttp

```
import aiohttp
import asyncio

async def fetch(session, url):
    async with session.get(url) as response:
        return await response.text()

async def main():
    async with aiohttp.ClientSession() as session:
        html = await fetch(session, 'http://python.org')
    print(html)

loop = asyncio.get_event_loop()
loop.run_until_complete(main())
```

# We're Hiring!!!

**TEMOS VAGAS!!!**

# TALENTOS.GLOBO.COM

TALENTOS GLOBO.COM

**VOCÊ NASCEU PRA ISSO!**

# Contato

Onde me encontrar

---



**@brunobbbs**