# to GIL or not to GIL: the Future of Multi-Core (C)Python

Eric Snow PyCon 2019

https://bit.ly/2UMMJey

@ericsnowcrntly

#### Who Am I?

- software engineer at Microsoft (Python extension for VS Code)
- CPython core developer (since 2012)
  - 8 PEPs (5 accepted, 3 open)
  - sys.implementation
  - o module.\_\_spec\_\_
  - C OrderedDict

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  - C OrderedDict
- tired of hearing about how the GIL makes Python awful
- in late 2014 decided to do something about it

#### Overview

- 1. Context
  - CPython's Architecture
  - What happens when Python Runs?
  - Threads and Locks
- 2. The GIL
- 3. The Future
  - The C-API
  - Subinterpreters!
- 4. Q&A

# Context

# An Overview of CPython's Architecture

process

- the OS process

runtime

everything Python-related in a process

interpreter

- all Python threads and everything they share

Python thread

- wrapper around OS thread with eval loop inside

call stack

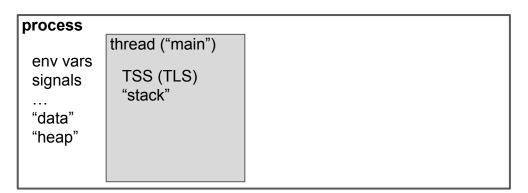
- stack of eval loop instances (i.e. Python function calls)

eval loop

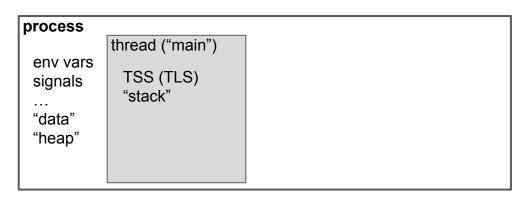
- executes the sequence of instructions in a code obj

process			
•			
env vars			
signals			

1. process initializes



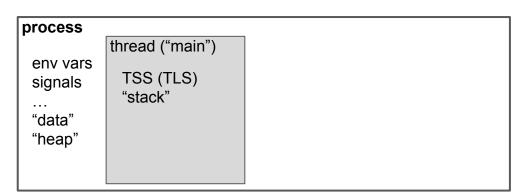
- 1. process initializes
- 2. main thread starts



- process initializes
   main thread starts
- 3. Python runtime initializes

```
CPython runtime

config
PyMem
...
```

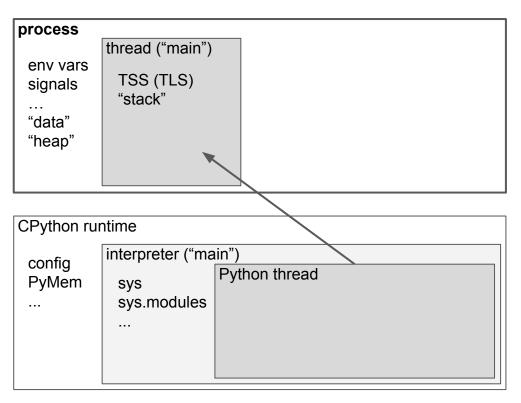


process initializes
 main thread starts
 Python runtime initializes

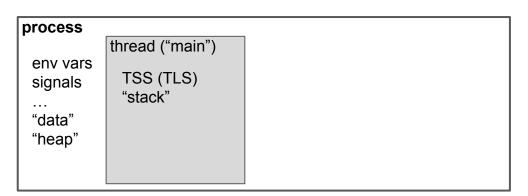
 main interpreter initializes

CPython runtime

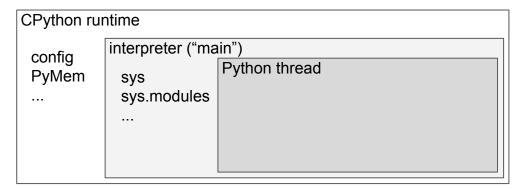
config
PyMem
sys
sys.modules
...

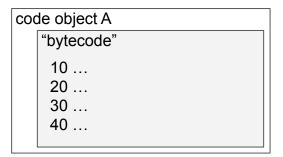


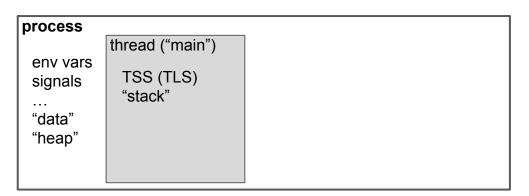
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- main thread starts
- 3. Python runtime initializes
  - a. main interpreter initializes
  - b. main Py thread initializes



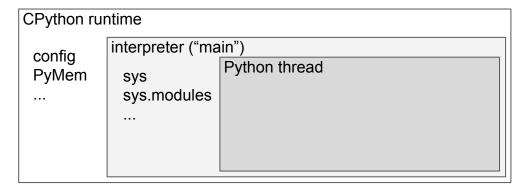
- process initializes main thread starts Python runtime initializes
  - main interpreter initializes
    - main Py thread initializes
  - Python program loads

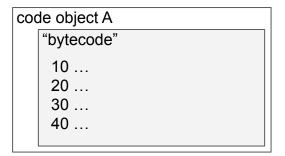


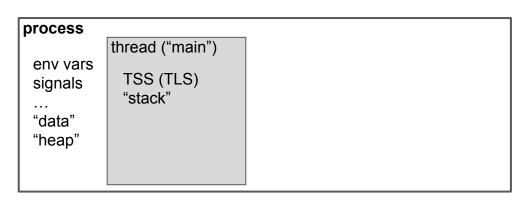




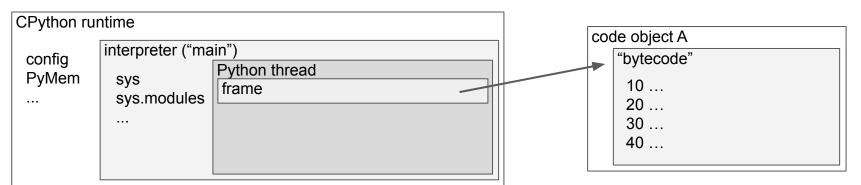
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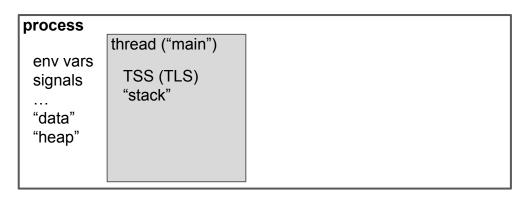


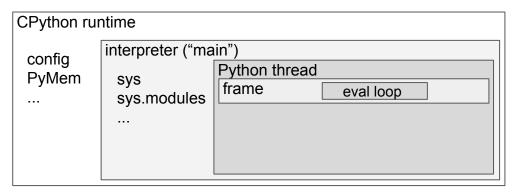




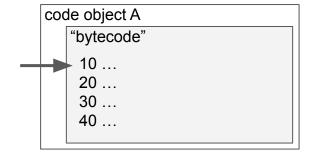
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#### The Eval Loop

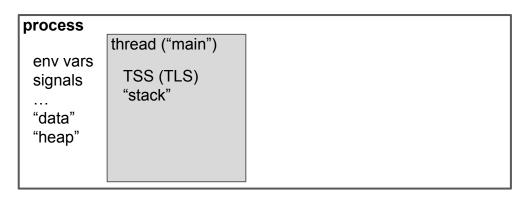
<set up>

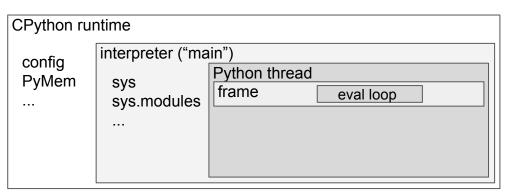
for instruction in code object:

<maybe side-channel stuff>

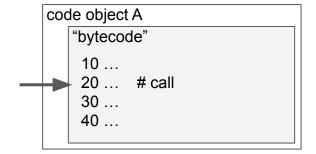
<occasionally release & re-acquire the GIL>

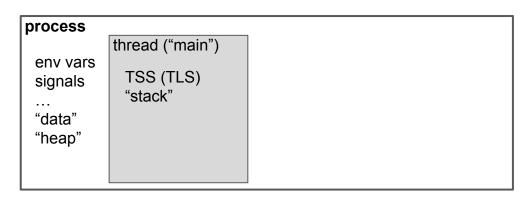
<execute next instruction>



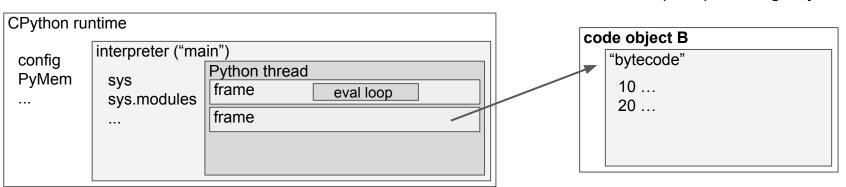


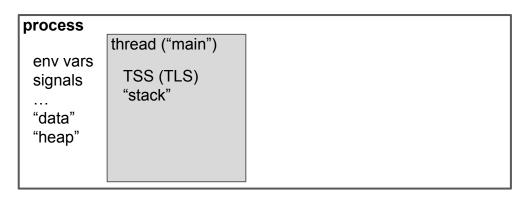
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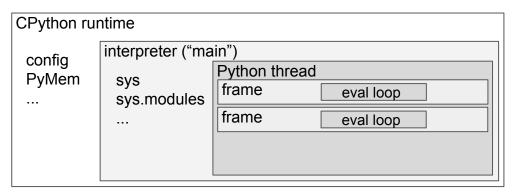




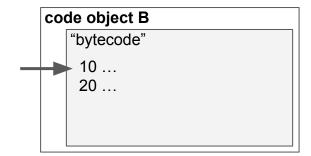
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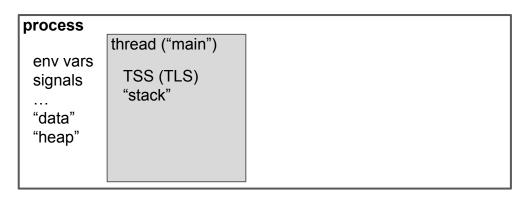


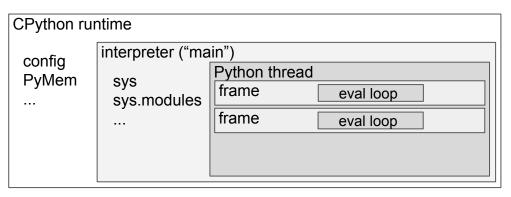




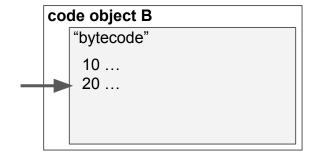
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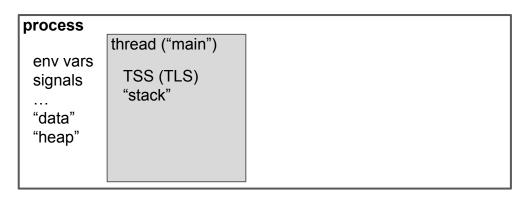


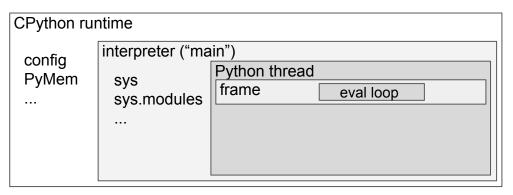




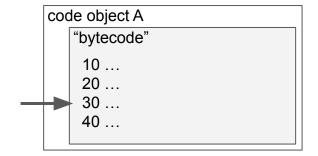
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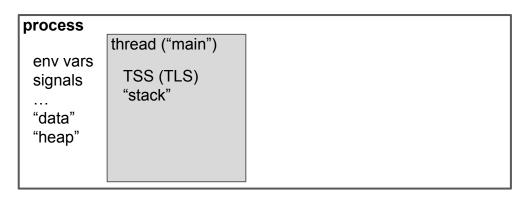


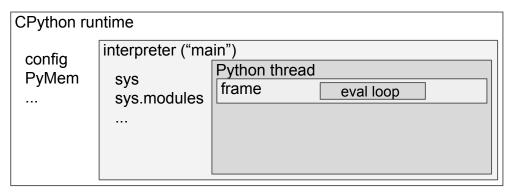




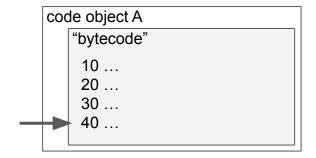
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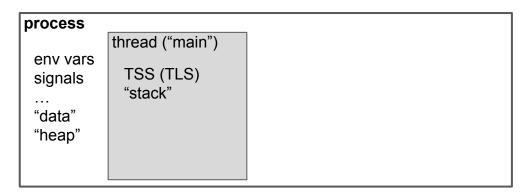


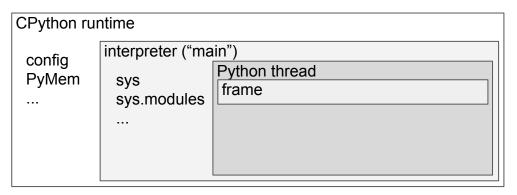




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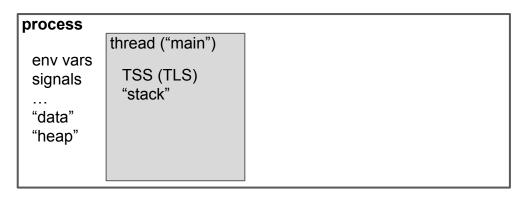


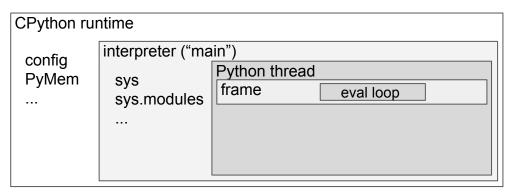
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```
code object A

"bytecode"

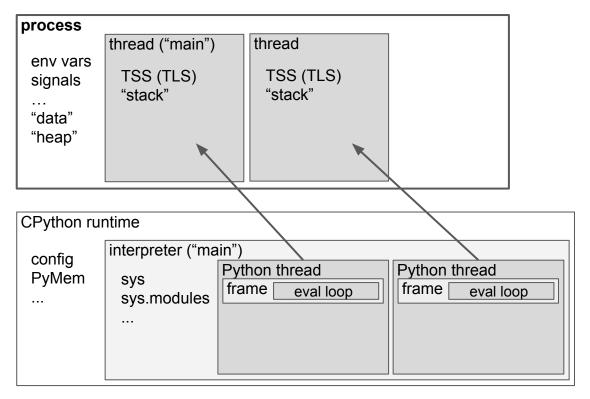
10 ...
20 ...
30 ...
40 ...
```





```
"bytecode"
A10 ...
A20 ...
B10 ...
B20 ...
A30 ...
A40 ...
```

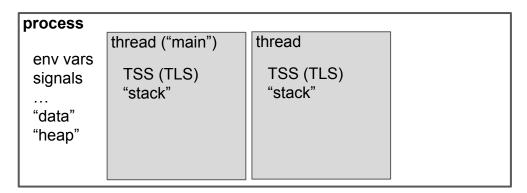
```
def spam():
t = threading.Thread(target=spam)
t.start()
t.join()
         _main__
        A10 ...
        A20 ...
        B10 ...
        B20 ...
        A30 ...
        A40 ...
       spam()
        C10 ...
        C20 ...
```

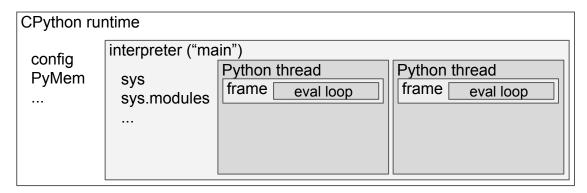


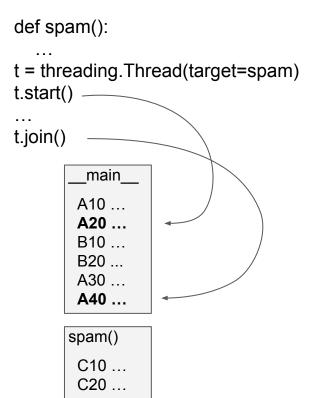
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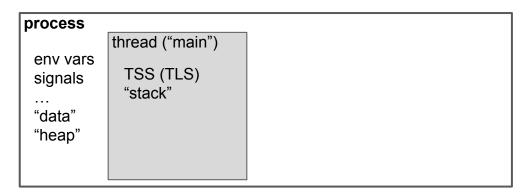
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__main__
A10 ...
A20 ...
B10 ...
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A30 ...
A40 ...
```

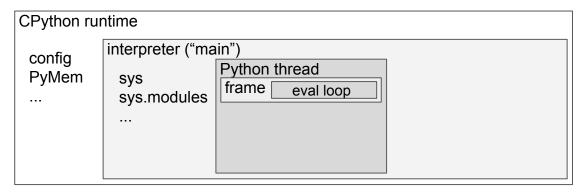
```
spam()
C10 ...
C20 ...
```

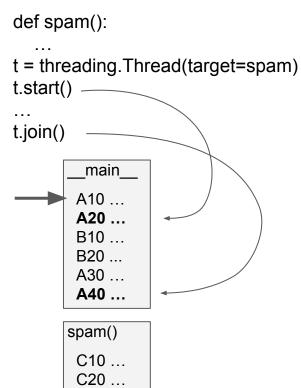


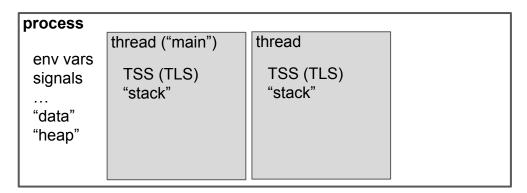


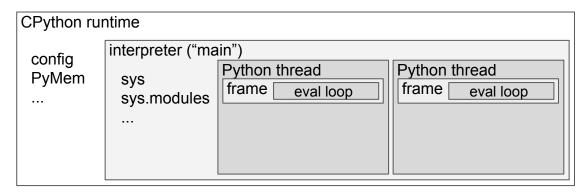


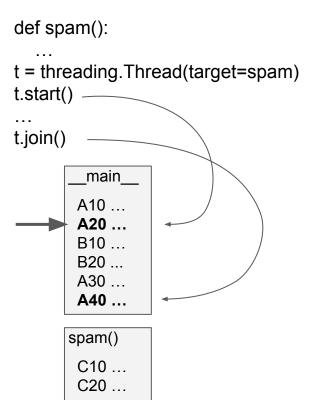


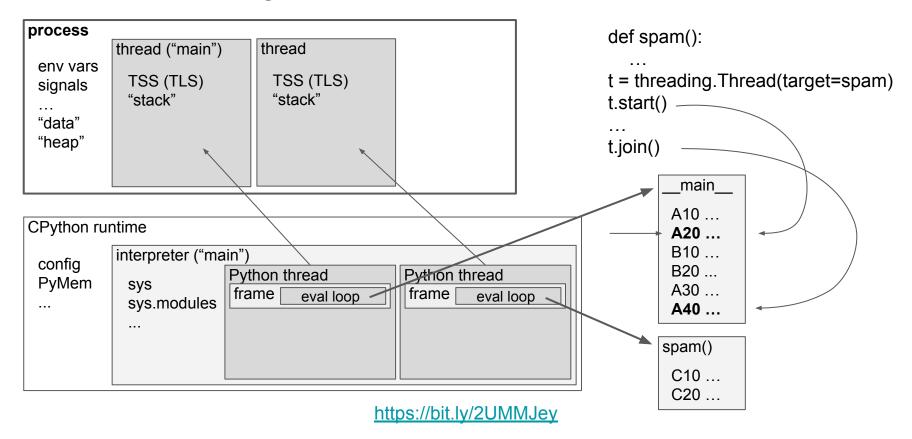


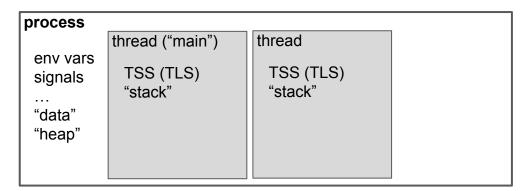


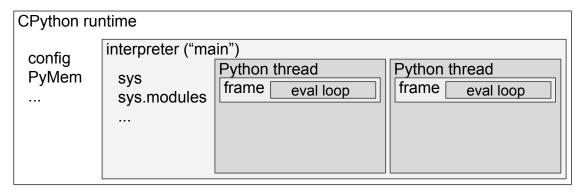


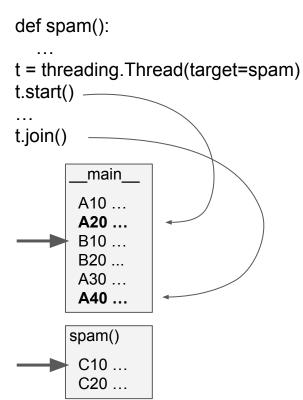


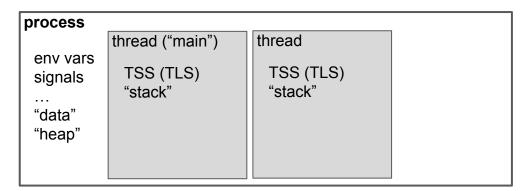


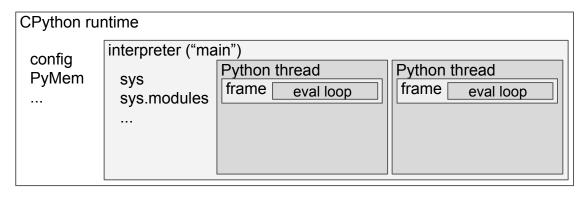


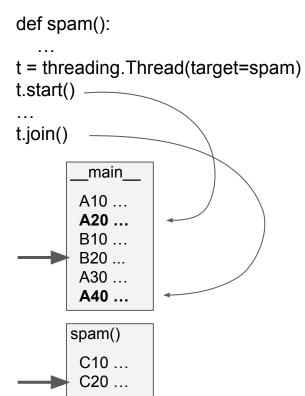


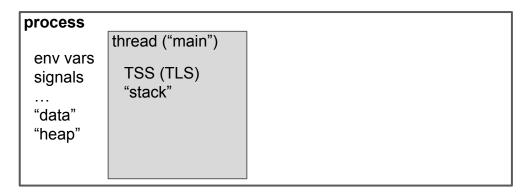


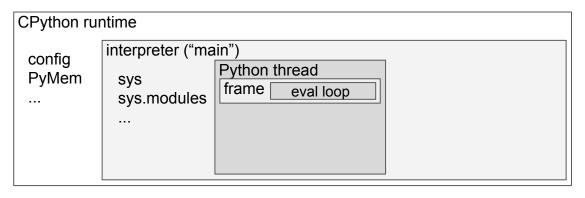


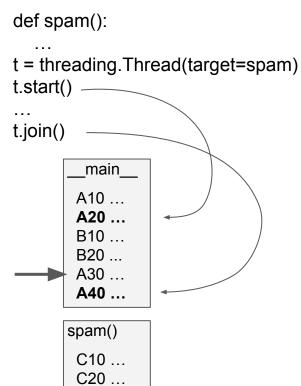


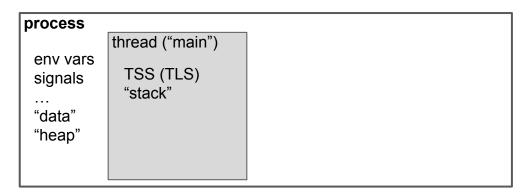


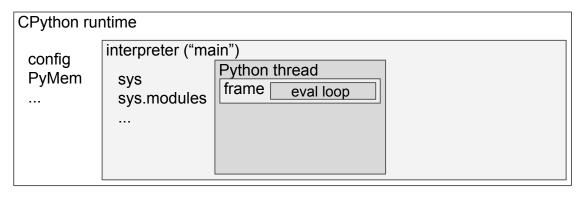


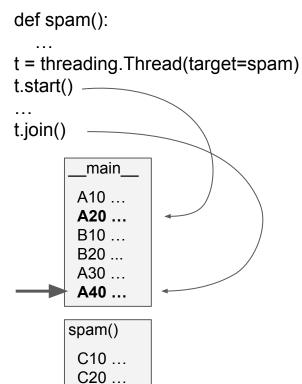


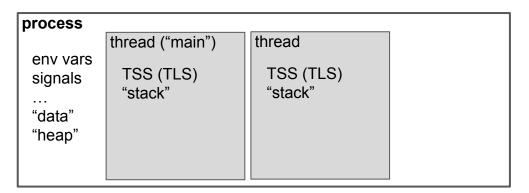


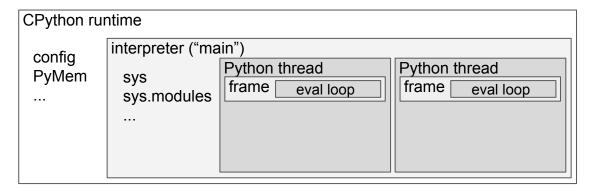










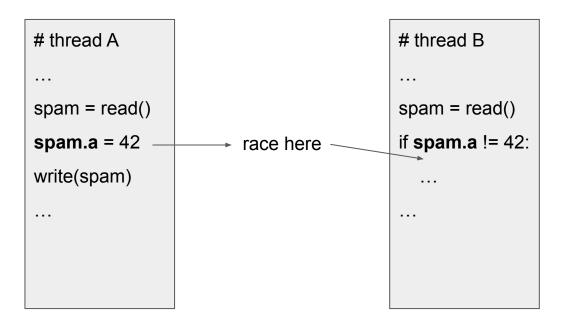


```
def spam():
    ...
t = threading.Thread(target=spam)
t.start()
...
t.join()
```

"bytecode"						
A10						
A20	# t.start()					
B10	C10	B10	C10			
B20	C20	C10	B10			
A30	B10	B20	B20			
C10	B20	C20	A30			
C20	A30	A30	C20			
A40	# t.join()					

#### "Race Condition"

#### A.K.A. "Resource Contention"



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#### A.K.A. "Resource Contention"

# thread A # thread B acquire lock A -> acquire lock A -> spam = read() spam = read() spam.a = 42if spam.a != 42: write(spam) release lock A -> release lock A -> . . .

#### "Race Condition"

#### A.K.A. "Resource Contention"

# thread A # thread B acquire lock A -> acquire lock A -> spam = read() spam = read() spam.a = 42if spam.a != 42: write(spam) release lock A -> release lock A -> . . .

#### "Race Condition"

#### A.K.A. "Resource Contention"

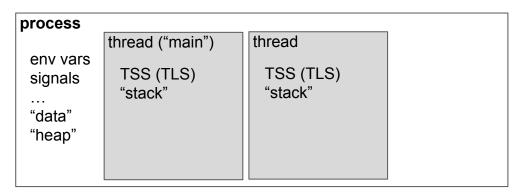
# thread A acquire lock A -> spam = read() spam.a = 42write(spam) release lock A -> . . .

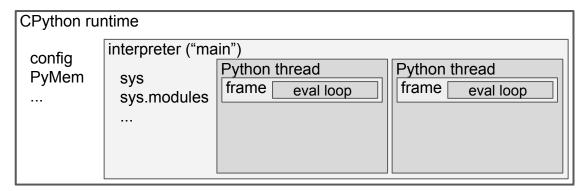
# thread B acquire lock A -> spam = read() if spam.a != 42: release lock A ->

spam = read() spam.a = 42write(spam) spam = read() if spam.a != 42:

# The GIL

### The GIL ("Global Interpreter Lock")





```
def spam():
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t = threading.Thread(target=spam)
t.start()
...
t.join()
```

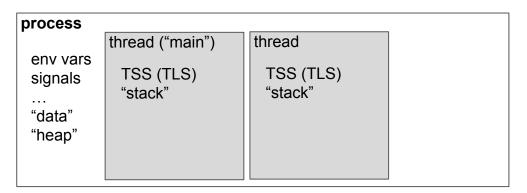
```
__main___
A10 ...
A20 ...
B10 ...
B20 ...
A30 ...
A40 ...
```

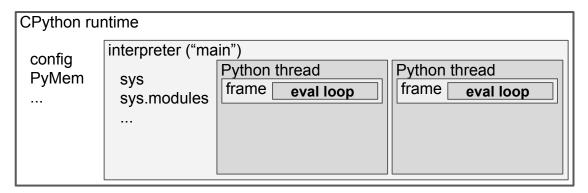
C10 ...

## State At Different Layers

process ->	global runtime ->	interpreter ->	thread / stack / ceval
env vars	GIL	sys module	current frame
sockets	signal handlers	modules	stack depth
file handles	Py_AtExit() funcs	atexit handlers	"tracing"
signals	GC	fork handlers	hook: trace
(thread-local storage)	allocator (mem)	hook: eval_frame	hook: profile
	objects (w/ refcounts)	codecs	current exception
	pending calls		context
	"eval breaker"		

#### The GIL ("Global Interpreter Lock")





```
def spam():
t = threading.Thread(target=spam)
t.start()
t.join()
         main
        A10 ...
        A20 ...
        B10 ...
        B20 ...
        A30 ...
        A40 ...
       spam()
        C10 ...
```

C20 ...

#### The Eval Loop

<set up>

for instruction in code object:

<maybe side-channel stuff>

<occasionally release & re-acquire the GIL>

<execute next instruction>

#### When is the GIL Released?

- eval loop: every few instructions
- around C code that does not touch runtime resources
- around IO operations
- (by C extensions)

#### Costs and Benefits of the GIL

- Multi-core parallelism of Python code Cheaper than fine-grained locks

???

- Simpler eval loop implementation
- Simpler object implementation
- Simpler C-API implementation

#### Costs and **Benefits** of the GIL

- Multi-core parallelism of Python code Cheaper than fine-grained locks

???

- Simpler implementation
  - eval loop
  - object system
  - o C-API

#### Effect and Perception

Who does it really affect?

- Users with threaded, CPU-bound \*Python\* code (relatively few people)
- Basically no one else

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Why? C implementation releases the GIL around IO and CPU-intensive code.

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Who does it really affect?

- Users with threaded, CPU-bound \*Python\* code (relatively few people)
- Basically no one else

So why does the GIL get such a bad wrap?

- Lack of understanding
- Experience with other programming languages
- Haters gonna hate

#### Working Around the GIL

- C-extension modules
  - rewrite CPU-bound code in C
  - release the GIL around that code
- multi-processing
- (async / await)

#### Past Efforts to Remove the GIL

- 1999 Greg Stein
- Larry Hastings' Gilectomy (on hold)
- other Python implementations
  - unladen swallow
  - 0 ...

### Other Python Implementations

	GIL?	C-API?	latest Py version
CPython	yes	yes	3.7
<u>Jython</u>	no	<u>JyNI</u>	2.7
IronPython	no	<u>yes?</u>	2.7
PyPy (& w/STM)	<u>ves</u> (no)	<u>cffi, cpyext</u>	3.6
MicroPython	~yes	no?	<u>~</u> 3.4+

# The Future

#### A New C-API

- the history
- the problem
- the solutions

#### The C-API

- historically fundamental to Python's success
- organic growth
- early efforts to simplify
- core devs: growing concerns
- core devs: increasing efforts

#### The Problem

- getting rid of GIL needs low-level changes
- parts of public C-API expose low-level details (e.g. refcounts)
- SO...
- getting rid of GIL requires breaking parts of C-API

#### The Causes

- didn't think 20+ years into future
- "consenting adults"
- accidental leaks

- someone has to care enough to do the work
- physically separate the categories of C-API
- more opaque structs
- Python (C)FFI
- (maybe) break compatibility in a few places
- deprecate C-API in favor of something like Cython (official)
- ...

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- physically separate the categories of C-API
- more opaque structs
- Python (C)FFI
- (maybe) break compatibility in a few places
- deprecate C-API in favor of something like Cython (official)
- ...

- someone has to care enough to do the work
- physically separate the categories of C-API
- more opaque structs
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- (maybe) break compatibility in a few places
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#### Categorizing the C-API

"internal" "Do not touch!"

"private" "Use at your own risk!"

"unstable" "Go for it (but rebuild your extension each Python release)!"

"stable" "Worry-free!"

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- physically separate the categories of C-API
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#### The Projects

- Victor Stinner's, well, all of it
  - https://pythoncapi.readthedocs.io/roadmap.html
- Steve Dower's efforts
  - https://mail.python.org/archives/list/capi-sig@python.org/thread/B2VDVLABM4RQ4ATEJXFZYWEGTBZPUBKW/
- Petr Viktorin's projects
- bringing sanity to runtime initialization and finalization
- others

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## Beyond the C-API...

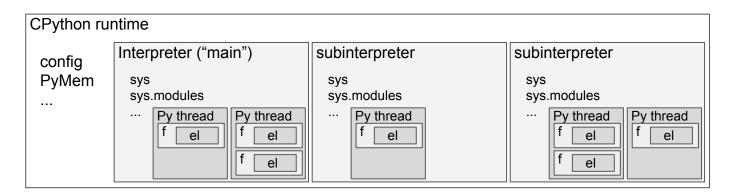
# Subinterpreters

#### Interpreters in a Single Process

- initial interpreter: "main"
  - has certain responsibilities
- "subinterpreter": any other interpreter created within the runtime
- isolated-ish

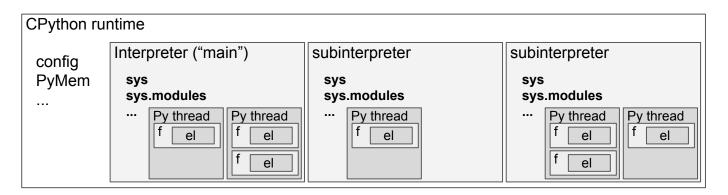
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- C-API for over 20 years
- PEP 554: stdlib module

#### PEP 554 - "Multiple Interpreters in the Stdlib"

- https://www.python.org/dev/peps/pep-0554/
- new "interpreters" module
  - create(), list\_all(), etc.
  - Interpreter class
  - create\_channel()
  - o RecvChannel, SendChannel

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```
import interpreters
interp = interpreters.create()
interp.run(dedent("""
    print('spam')
""""))
```

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interp = interpreters.create()
interp.run(dedent("""
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```

```
interp = interpreters.create()
def func():
  interp.run(dedent("""
     print('spam')
t = threading.Thread(target=func)
t.start()
```

```
interp = interpreters.create()
interp.run(dedent("""
  x = 'spam'
interp.run(dedent("""
  print(x)
```

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#### For now:

- limited supported types
  - str, int, None, etc.
  - PEP 3118 buffers
- actual objects not shared
- no buffering

```
(rchan, schan
) = interpreters.create channel()
                                           t = threading.Thread(target=func)
interp = interpreters.create()
                                           t.start()
def func():
                                            data = rchan.recv() # blocks
  interp.run(dedent("""
                                            process data(data)
     import spam
    data = spam.do something()
     ch.send(data) # blocks
  """, channels={ch: schan})
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  - o "opt-in sharing"
- "the isolation of processes, with the efficiency of threads"
- gateway to multi-core CPython

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# Stop Sharing the GIL!!!

# State At Different Layers

process ->	global runtime ->	interpreter ->	thread / stack / ceval
env vars	GIL	sys module	current frame
sockets	signal handlers	modules	stack depth
file handles	Py_AtExit() funcs	atexit handlers	"tracing"
signals	GC	fork handlers	hook: trace
(thread-local storage)	allocator (mem)	hook: eval_frame	hook: profile
	objects	codecs	current exception
	pending calls		context
	"eval breaker"		

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- allow each interpreter to execute independently
- threads within an interpreter would still share a "GIL"
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- no change to single-threaded (or single-interpreter) performance

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# Why Hasn't It Been Done Already?

- forgotten feature
- no one interested enough (to do the work)
- "good enough" alternatives
- scary! (or not)
- blockers...

- lingering bugs
- subinterpreters only in C-API
- how to guard against races between interpreters?
- enough time to do the work!
- C globals

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#### C "Globals"

- "static globals", "static locals"
- TSS/TLS (Thread-Specific Storage)
- in the CPython code base
- in extension modules
  - static types, exceptions, singletons; etc.
  - C globals in included shared libraries (e.g. <u>OpenSSL in cryptography</u>)
  - efforts to fix: PEPs <u>3121</u>, <u>384</u>, <u>489</u>, (<u>573</u>), <u>575</u>, (<u>579</u>), (<u>580</u>); Cython; Red Hat; Instagram
  - (type "slots")

#### the project

https://github.com/ericsnowcurrently/multi-core-python

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- resolve bugs
- deal with C globals
- move some runtime state into the interpreter state
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#### **Beneficial Side Effects**

- find bugs and deficiencies in runtime (e.g. init/fini)
- motivation to fix them.
- clean-up in runtime implementation (incl. globals, C-API, header files)
- reduce coupling between components in runtime implementation
- encourage fewer static globals in C extension modules
- (improve interpreter startup performance)
- (improve object isolation (e.g. in memory))
- ...

#### What's Next?

- 1. PEP 554, blockers, and per-interpreter GIL
- 2. low-hanging fruit (optimization)
- 3. deferred functionality

# Thanks!

# Thanks!

Questions?

#### Resources

- https://docs.google.com/presentation/d/1BuU6e-CKdZxDL5z9VBp19LAaIY8Ys2-jlcz-mD0Vr3c/
  - https://bit.ly/2UMMJey
- https://github.com/ericsnowcurrently/multi-core-python
- https://docs.python.org/3/c-api/init.html#thread-state-and-the-global-interpreter-lock
- https://wiki.python.org/moin/GlobalInterpreterLock#Eliminating\_the\_GIL
- twitter: <u>@ericsnowcrntly</u>