No time to idle about: Profiling import time in Python

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Me!

Me!!! Daniel Porteous!

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Agenda

- How to acquire import time data.
- How to understand the data through visualisation.
- Suggestions for fixing the problem.

The problem

Imports are slow, and you don't know why

- Why are slow imports a problem?
 - Mainly, command line tools.
 - Worsens dev iteration time.
- How do we fix the problem?
 - First, understand it.

Looking at an example

Sloooooooow imports z^Z z^Z z^Z

```
1 import small
main.py 2 import large
        3 print("Hi Pycon AU 2019!")
        1 import time
small.py
                                   $ time python main.py
       2 time.sleep(1)
                                   Hi Pycon AU 2019!
          import time
                                    real 0m11.061s
large.py
        2 time.sleep(10)
```

Per module import times

A few different approaches

- Time each import directly in your own code.
 - Explicit time statements, context managers.
- Modify module Finders / Loaders.
- Probes???

Per module import times

A few different approaches

- -X importtime in 3.7.
 - Also the PYTHONPROFILEIMPORTTIME environment variable.
- Supported directly in Python/import.c.
- Thanks to the community and 3.7 contributors!
 - Special thanks to Victor Stinner and Inada Naoki!!!

Back to our example

Still slow, who's the culprit!

```
import small
        2 import large
main.py
        3 print("Hi!")
        1 import time
small.py
        2 time.sleep(1)
          import time
large.py
        2 time.sleep(10)
```

```
$ python -X importtime main.py
  import time: self [us]
                         cumulative
                                      imported package
  import time:
                                145
                                      zipimport
                                      _frozen_importlib_external
  import time:
                    737
                     73
                                 73
  import time:
                                         _codecs
  import time:
                   6401
                               6474
                                        codecs
                 -X importtime main py
  python
                                      encodings_utf 8
  import time:
                    512
  import time:
                    115
                                      _signal
  import time:
                    576
                                      encodings.latin_1
                                576
  imnort time.
                                 51
$ PYTHONPROFILEIMPORTTIME="""
                                           _stat
    python main py
                                          stat
  import time:
                   1073
                               1073
                                           genericpath
  import time:
                   2533
                               3605
                                          posixpath
                               4793
  import time:
                   4793
                                          _collections_abc
                              14072
  import time:
                   4456
                                        05
  import time:
                   1277
                                         _builtin__
                               1277
  import time:
                                          _locale
                    190
                                190
                    639
                                        _bootlocale
  import time:
  import time:
                   1761
                               1761
                                        sitecustomize
  import time:
                   4901
                              22838
                                      site
                    719
  import time:
                                719
                                        time
  import time:
                1003709
                            1004428
                                      small
  import time:
               10003076
                           10003076
                                      large
```

Hi Pycon AU 2019!

Individual import times

Knowledge is power 😌 🕉

```
$ python -X importtime main.py
import time: self [us]
                         cumulative
                                       imported package
import time:
                                         time
                                 719
                   719
import time:
            1003709
                            1004428
                                       small
import time: 10003076
                           10003076
                                       large
Hi Pycon AU 2019!
```

```
$ python -X importtime main.py
                                                                     dport.me/pycon.pdf
import time: self [us]
                          cumulative
                                        imported package
import time:
                    145
                                  145
                                        zipimport
                    737
import time:
                                  737
                                        _frozen_importlib_external
                     73
                                   73
                                            _codecs
import time:
                   6401
                                 6474
import time:
                                          codecs
                   2292
import time:
                                 2292
                                          encodings.aliases
import time:
                   1780
                               10545
                                        encodings
                                        encodings.utf_8
import time:
                    512
                                  512
import time:
                    115
                                  115
                                        _signal
import time:
                    576
                                  576
                                        encodings.latin_1
                     51
                                   51
import time:
                                            _abc
import time:
                   1233
                                 1283
                                          abc
import time:
                   1084
                                 2367
                                        io
import time:
                                              _stat
                   1144
                                 1220
import time:
                                            stat
                   1073
                                 1073
import time:
                                              genericpath
                   2533
                                 3605
import time:
                                            posixpath
                                            _collections_abc
                   4793
import time:
                                 4793
                   4456
import time:
                               14072
                                          05
import time:
                   1277
                                 1277
                                            builtin_
                    190
                                             locale
import time:
                                  190
                                           bootlocale
import time:
                    639
                                  829
import time:
                   1761
                                 1761
                                          sitecustomize
import time:
                   4901
                                22838
                                        site
                    719
                                          time
import time:
                                 719
import time:
               1003709
                             1004428
                                        small
import time: 10003076
                            10003076
                                        large
Hi Pycon AU 2019!
```

Discussion TODO

- Default output is great! 3.7 changed the game here.
 - The output still requires study.
- Visualisation is powerful because you can identify problems immediately.
- Flamegraphs are common visualisations of stack data.

Structuring the data

```
$ python -X importtime main.py 2> main.stderr
Hi Pycon AU 2019!
$ cat main.stderr | python tree.py --basic > main.tree
everything 38523
 small 454 main.tree
  time 528
 large 1496528
large 1496
$ flamegraph.pl main.tree --flamechart tree > main.svg
```



- Tuna: https://github.com/nschloe/tuna
 - Big thanks to Nico Schloemer!

```
$ python -X importtime main.py &> main.stderr
```

```
$ tuna main.stderr
```

Starts up a Python webserver

Is a tree the right data structure?

The import structure isn't strictly a tree, it's a graph

Demonstrating import behaviour

```
1 import small
                                               main
          import large
main.py
        3 print("Hi!")
        cumulative
self
                      package
  528
                        time
                528
                                    small
                                                          large
  454
                981
                      small
 1496
               1496
                       large
          import time
large.py
                                               time
        2 time.sleep(10)
```

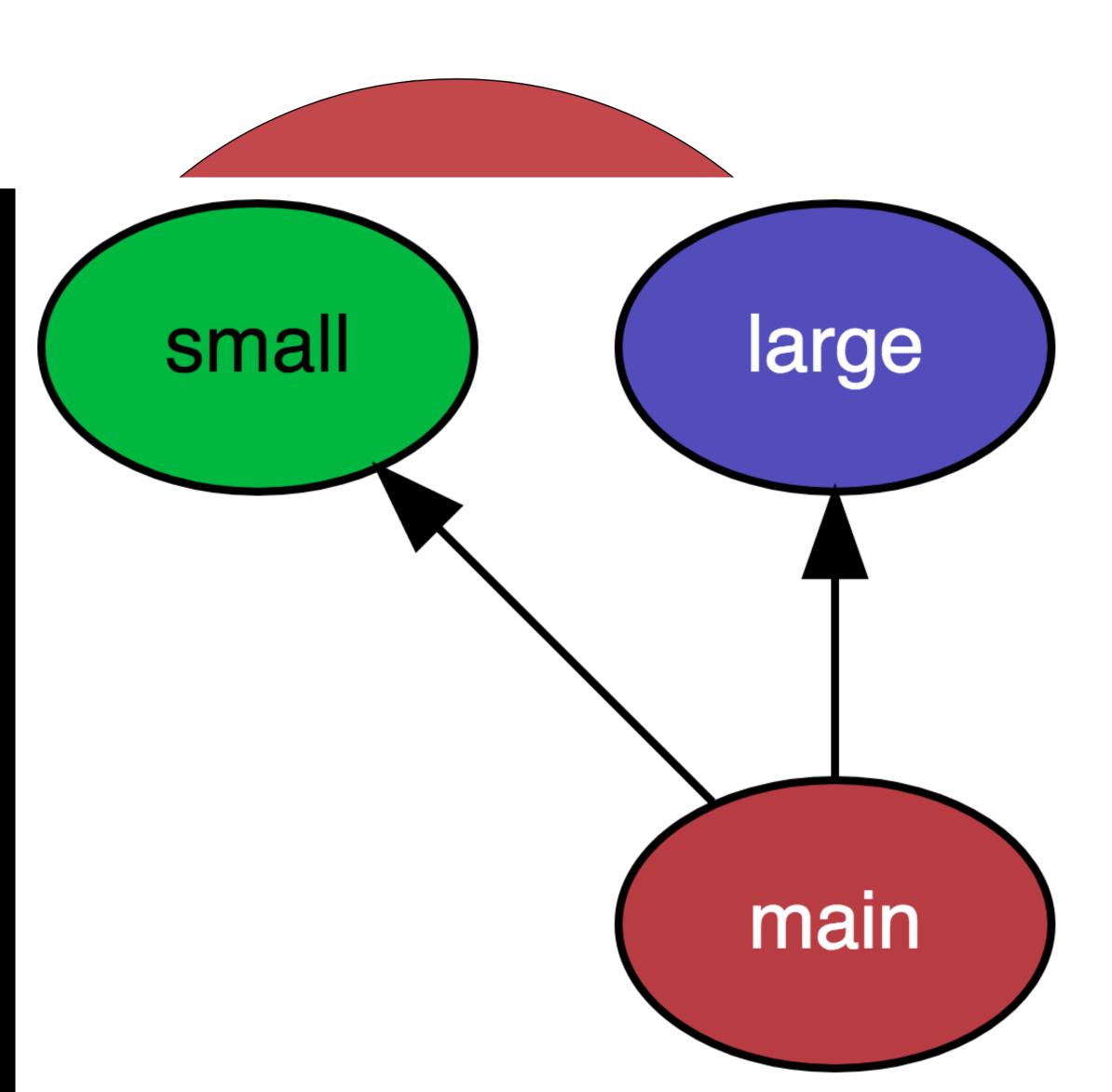
Showing imports as a graph

- Pydeps: https://github.com/thebjorn/pydeps
 - Open source project that produces import graphs
 - Big thanks to Bjørn Pettersen!

\$ pydeps main.py --max-bacon 0 -o main.svg

We've tweaked the numbers

```
1 import small
main.py 2 import large
        3 print("Hi!")
        1 import time
small.py
        2 time.sleep(1)
          import time
large.py
        2 time.sleep(10)
```



Connectedness metrics???

What can we do with this information?

Tuna: https://github.com/nschloe/tuna

Big thanks to Nico Schloemer!

```
$ python -X importtime main.py &> main.stderr
$ tuna main.stderr
# Starts up a Python webserver
```

Propose node cost with just import time and connected ness

Tuna: https://github.com/nschloe/tuna

Big thanks to Nico Schloemer!

```
$ python -X importtime main.py &> main.stderr
```

```
$ tuna main.stderr
```

Starts up a Python webserver

Get unique attribute accesses

What can we do with this information?

Tuna: https://github.com/nschloe/tuna

Big thanks to Nico Schloemer!

```
$ python -X importtime main.py &> main.stderr
$ tuna main.stderr
```

Starts up a Python webserver

Suggest node cost with import time, connectedness, and unique attribute access all together

<import time>

<num connections> * <unique attributes accessed>

- \$ python -X importtime main.py &> main.stderr
- \$ tuna main.stderr
- # Starts up a Python webserver

Improving import time

Finally!

BLAH

BLAAAAHHHHHHH

BLAH

BLAAAAHHHHHHH

contextlib.suppress

```
1 def kill_process(pid):
2     try:
3         os.kill(pid, signal.SIGKILL)
4     except ProcessLookupError:
5         pass
```

contextlib.suppress

1 from contextlib import suppress

contextlib.suppress

```
1 from contextlib import suppress
2
3 def kill_process(pid):
4     with suppress(ProcessLookupError):
5     os.kill(pid, signal.SIGKILL)
```

contextlib.suppress

```
1 from contextlib import suppress
3 def kill_process(pid):
      with suppress(ProcessLookupError):
          os.kill(pid, signal.SIGKILL)
1 def kill_process(pid):
      try:
          os.kill(pid, signal.SIGKILL)
      except ProcessLookupError:
          pass
```

```
1 # Bad!!!
2 pool = ThreadPoolExecutor()
3 for k, v in data.items():
4     pool.submit(myfunc, k, v)
5 # Wait on the results and do something with them.
6 pool.shutdown()
```

```
1 # Bad!!!
2 pool = ThreadPoolExecutor()
3 for k, v in data.items():
4 pool.submit(myfunc, k, v)
5 # Wait on the results and do something with them.
6 pool.shutdown()
1 # Good, safe, context managed!
2 with ThreadPoolExecutor() as pool:
      for k, v in data.items():
          pool.submit(myfunc, k, v)
```

```
1 data = {
2    "Watermelon": "delicious",
3    "Fruit": "spectacular",
4    "Dairy": "scary",
5    "Chicken": "not cool",
6 }
```

```
1 data = {
2    "Watermelon": "delicious",
3    "Fruit": "spectacular",
4    "Dairy": "scary",
5    "Chicken": "not cool",
6 }
7
8 def myfunc(noun, adj):
9    return f"{noun} is {adj}!"
```

Write your own context managers!

Our very own context manager!

Simple!

```
1 class MyContextManager:
       def __enter__(self):
           print("Enter!")
3
       def __exit__(self, *exc):
6
           print("Exit!")
 8
  with MyContextManager():
       print("Inside the block!")
10
```

Our very own context manager!

Simple!

```
1 class MyContextManager:
       def __enter__(self):
           print("Enter!")
 3
       def __exit__(self, *exc
           print("Exit!")
 6
 8
  with MyContextManager():
       print("Inside the block!")
10
```

Our very own context manager!

Super simple!

```
1 class MyContextManager:
       def __enter__(self):
           print("Enter!")
3
                                       $ python3 example.py
       def __exit__(self, *exc):
                                       Enter!
6
           print("Exit!")
                                       Inside the block!
                                       Exit!
 8
  with MyContextManager():
       print("Inside the block!")
10
```

As neat as it gets!

```
1 class FoodContextManager:
       def __init__(self):
 3
           self.data = {}
       def __enter_ (self):
           print(f"Enter: {self.data}")
           return self.data
 8
 9
       def __exit__(self, *exc):
           print(f"Exit: {self.data}")
12 with FoodContextManager() as data:
       data["fruit"] = "delicious"
13
```

As neat as it gets!

```
1 class FoodContextManager:
      def ___init__(self):
           self.data = {}
      def __enter_(self):
           print(f"Enter: {self.data}")
           return self.data
 8
       def __exit__(self, *exc):
           print(f"Exit: {self.data}")
12 with FoodContextManager() as data:
       data["fruit"] = "delicious"
```

A fully fledged context manager!

```
1 class FoodContextManager:
       def __init__(self, data):
 3
           self.data = data
 45
       def __enter_ (self):
           print(f"Enter: {self.data}")
           return self.data
 8
 9
       def __exit__(self, *exc):
           print(f"Exit: {self.data}")
12 with FoodContextManager({"dairy": "yuck"}) as data:
       data["fruit"] = "delicious"
13
```

A fully fledged context manager!

```
1 class FoodContextManager:
      def ___init__(self, data):
           self.data = data
      def __enter_(self):
           print(f"Enter: {self.data}")
          return self.data
 8
       def __exit__(self, *exc):
           print(f"Exit: {self.data}")
12 with FoodContextManager({"dairy": "yuck"}) as data:
      data["fruit"] = "delicious"
```

dport.me/pycon.pdf "Boy, that sure was a lot of work" — Me when I first wrote a context manager this way

contextlib.contextmanager

@contextlib.contextmanager

This function is a <u>decorator</u> that can be used to define a factory function for <u>with</u> statement context managers, without needing to create a class or separate <u>enter_()</u> and <u>exit_()</u> methods.







```
1 def my_decorator(func):
2    def new_func():
3         return func() + "!!!!"
4    return new_func
```



```
1 def my_decorator(func):
      def new_func():
           return func() + "!!!"
3
       return new_func
5
6
7 def hello_pycon():
       return "Hello Pycon AU 2018!"
8
9
10
```



```
1 def my_decorator(func):
     def new_func():
          return func() + "!!!"
3
      return new_func
 @my_decorator
7 def hello_pycon():
      return "Hello Pycon AU 2018!"
8
9
```



```
1 def my_decorator(func):
      def new_func():
           return func() + "!!!"
 3
       return new_func
  @my_decorator
 7 def hello_pycon():
       return "Hello Pycon AU 2018!"
 8
 9
10 hello_pycon()
```



on AU 2018!!!!













```
1 @my_decorator
2 def hello_pycon():
3    return "Hello Pycon AU 2018!"
```



```
1 @my_decorator
2 def hello_pycon():
3    return "Hello Pycon AU 2018!"

1 def hello_pycon():
2    return "Hello Pycon AU 2018!"
3 hello_pycon = my_decorator(hello_pycon)
```

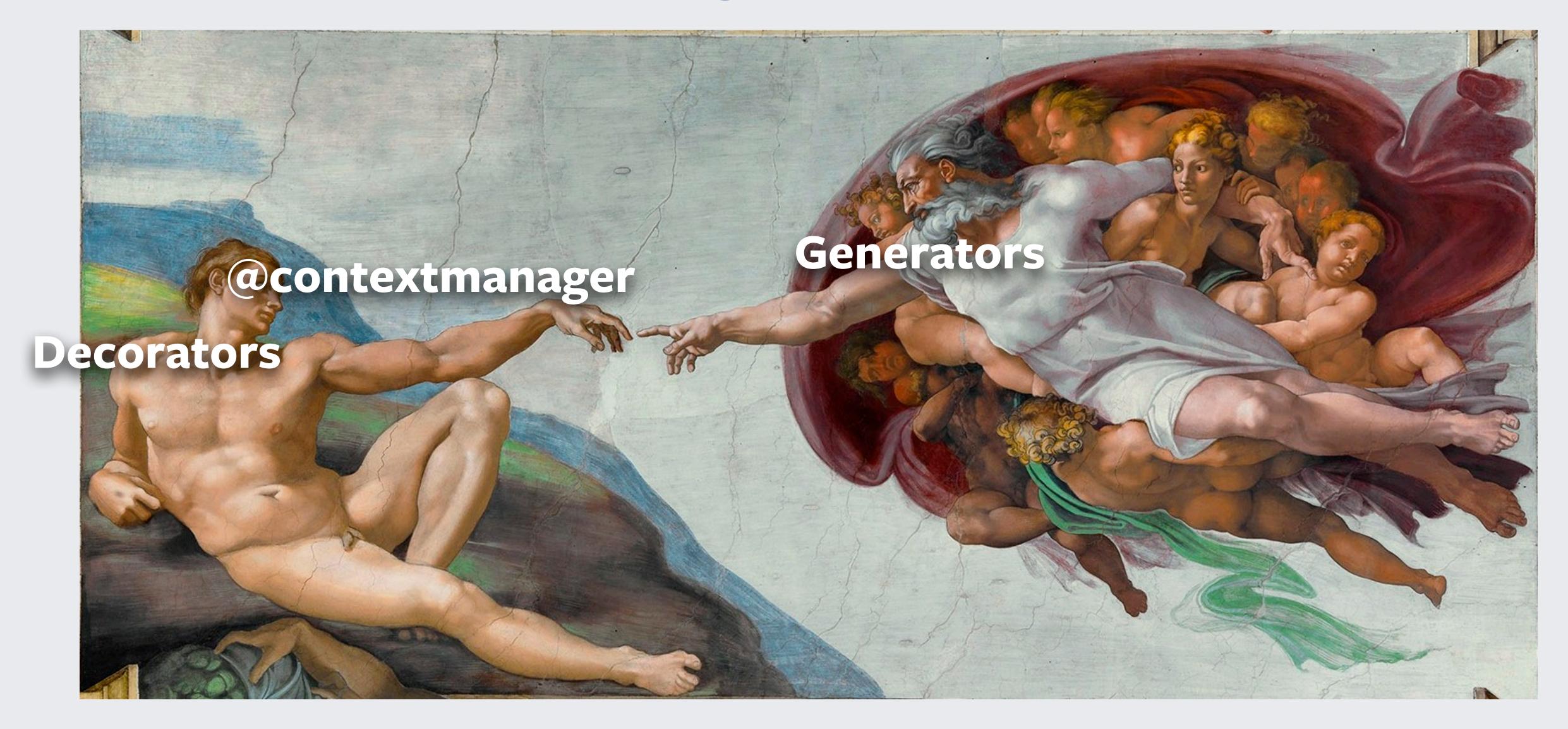
```
1 def first_n(n):
2    for i in range(n):
3    yield i
```

```
1 def first_n(n):
2    for i in range(n):
3    yield i
```

```
1 def first_n(n):
2    for i in range(n):
3
```

```
1 def first_n(n):
2    nums = []
3    for i in range(n):
4        nums.append(i)
5    return nums
```

Let's put them together



```
1 class MyContextManager:
       def __enter__(self):
2 3 4 5 6
           print("Enter!")
       def __exit__(self, *exc):
           print("Exit!")
 9 with MyContextManager():
       print("Inside the block!")
10
```

```
1 class MyContextManager:
                                   @contextmanager
2 3
       def __enter__(self):
                                   def my_context_manager():
           print("Enter!")
                                        print("Enter!")
4
                                        yield
5
6
                                        print("Exit!")
       def __exit__(self, *exc):
           print("Exit!")
                                   with my_context_manager():
                                        print("Inside the block!")
 9 with MyContextManager():
       print("Inside the block!")
10
```

```
1 class MyContextManager:
                                  @contextmanager
                                  def my_context_manager():
      def __enter__(self):
2 3
          print("Enter!")
                                      print("Enter!")
45
                                      yield
                                      print("Exit!")
      def __exit__(self, *exc):
6
          print("Exit!")
                                  with my_context_manager():
                                      print("Inside the block!")
9 with MyContextManager():
      print("Inside the block!")
```

```
1 class MyContextManager:
                                  @contextmanager
                                  def my_context_manager():
2 3
      def __enter_(self):
          print("Enter!")
                                      print("Enter!")
45
                                      yield
                                      print("Exit!")
      def __exit__(self, *exc):
6
          print("Exit!")
                                  with my_context_manager():
                                      print("Inside the block!")
9 with MyContextManager():
      print("Inside the block!")
```

Old school context management

```
1 class FoodContextManager:
       def ___init___(self, data):
           self.data = data
      def __enter_(self):
           print(f"Enter: {self.data}")
           return self.data
 8
 9
       def __exit__(self, *exc):
           print(f"Exit: {self.data}")
12 with FoodContextManager({"dairy": "yuck"}) as data:
       data["fruit"] = "delicious"
13
```

New hotness

```
1 from contextlib import contextmanager
3 @contextmanager
4 def FoodContextManager(data):
       print(f"Enter: {data}")
 5
       yield data
 6
       print(f"Exit: {data}")
 8
  with FoodContextManager({"dairy": "yuck"}) as data:
       data["fruit"] = "delicious"
10
```

New hotness

```
1 from contextlib import contextmanager
3 @contextmanager
4 def FoodContextManager(data):
       print(f"Enter: {data}")
5
       yield data
 6
       print(f"Exit: {data}")
 8
  with FoodContextManager({"dairy": "yuck"}) as data:
       data["fruit"] = "delicious"
10
```

New hotness

```
1 from contextlib import contextmanager
3 @contextmanager
4 def FoodContextManager(data):
       print(f"Enter: {data}")
5
       yield data
 6
       print(f"Exit: {data}")
 8
  with FoodContextManager({"dairy": "yuck"}) as data:
       data["fruit"] = "delicious"
10
```

Phew, that was a lot

Let's take a moment

Phew, that was a lot

Let's take a moment

- Context managers have:
 - __enter__()
 - __exit__()

Phew, that was a lot

Let's take a moment

- Context managers have:
 - __enter__()
 - __exit__()
- Generators and decorators are a thing that exist.

Phew, that was a lot

Let's take a moment

- Context managers have:
 - __enter__()
 - __exit__()
- Generators and decorators are a thing that exist.
- @contextmanager decorator is neat!

All the rest

Some things you should really know

- Scope
- Exceptions in __exit__
- try / finally with @contextmanager

Scope with Context Managers

Variables defined inside it still exist!

```
1 with open("myfile.txt") as f:
2   content = f.read()
3 print(content)
```

Scope with Context Managers

The thing yielded does too, but it'll be closed.

```
1 with open("myfile.txt") as f:
2    pass
3 content = f.read()
4 print(content)
5 # ValueError: I/O operation on closed file.
```

All the rest

Some things you should really know

- Scope
- Exceptions in __exit__
- try / finally with @contextmanager



```
1 class MyContextManager:
      def enter (self):
2 3
           print("Enter!")
4
5
       def __exit__(self, *exc):
6
           print("Exit!")
 9 with MyContextManager():
10
```

```
1 class MyContextManager:
      def enter (self):
2 3
           print("Enter!")
4 5
      def __exit__(self, *exc):
6
           print("Exit!")
 9 with MyContextManager():
10
```

```
def __exit__(
    self,
    exc_type,
    exc,
    exc_tb,
):
    print("Exit!")
```

Exception handling in __exit___

It's a little tricky

- Want to ignore exception?
 - Return True
- Want to raise exception?
 - Return False (or do nothing)
- Do not explicitly re-raise the exception.



```
1 class MyContextManager:
5
      def __exit__(self, exc_type, exc, exc_tb):
6
          if exc:
              print("Oh no!")
8
              call_for_help()
              return False
```



```
1 class MyContextManager:
5
      def __exit__(self, exc_type, exc, exc_tb):
6
          if exc:
              print("Oh no!")
              call_for_help()
```



```
1 class suppress:
       def ___init___(self, *exceptions):
           self.exceptions = exceptions
      def __enter_ (self):
5
6
           pass
       def __exit__(self, exc_type, exc, exc_tb):
8
           return
               exc_type is not None and
10
               issubclass(exc_type, self.exceptions)
12
```



```
1 class suppress:
      def __init__(self, *exceptions):
           self.exceptions = exceptions
   def __enter_(self):
5
           pass
       def __exit__(self, exc_type, exc, exc_tb):
8
           return
               exc_type is not None and
10
               issubclass(exc_type, self.exceptions)
12
```



```
1 class suppress:
      def __init__(self, *exceptions):
           self.exceptions = exceptions
   def __enter_(self):
5
           pass
      def __exit__(self, exc_type, exc, exc_tb):
8
           return
               exc_type is not None and
               issubclass(exc_type, self.exceptions)
12
```



```
1 class suppress:
      def __init__(self, *exceptions):
          self.exceptions = exceptions
   def __enter_(self):
5
           pass
      def __exit__(self, exc_type, exc, exc_tb):
8
           return
               exc_type is not None and
10
               issubclass(exc_type, self.exceptions)
12
```

All the rest

Some things you should really know

- Scope
- Exceptions in __exit__
- Exception handling in @contextmanagers

```
1 @contextmanager
2 def my_context_manager():
3     print("Before")
4     yield
5     print("After")
6
7 with my_context_manager():
8     print(f"Neat: {1/0}")
```

```
1 @contextmanager
2 def my_context_manager():
3     print("Before")
4     yield
5     print("After")
6
7 with my_context_manager():
8     print(f"Neat: {1/0}")
```

```
$ python3 16_contextmanager_exceptions.py
Before
Traceback (most recent call last):
   File "example.py", line 10, in <module>
     print(f"I love this number: {1/0}")
ZeroDivisionError: division by zero
```

```
1 @contextmanager
2 def my_context_manager():
3     print("Before")
4     yield
5     print("After")
6
7 with my_context_manager():
8     print(f"Neat: {1/0}")
```

```
1 @contextmanager
1 @contextmanager
                                2 def my_context_manager():
2 def my_context_manager():
                                     print("Before")
      print("Before")
      yield
                                     try:
      print("After")
                                          yield
                                     except Exception as e:
                                6
6
                                          print(f"Oh no: {e}")
7 with my_context_manager():
      print(f"Neat: {1/0}")
                                     finally:
                                8
8
                                          print("After")
                                9
```

```
1 @contextmanager
1 @contextmanager
                                2 def my_context_manager():
2 def my_context_manager():
                                     print("Before")
      print("Before")
      yield
                                     try:
      print("After")
                                          yield
                                     except Exception as e:
                                6
6
                                          print(f"Oh no: {e}")
7 with my_context_manager():
      print(f"Neat: {1/0}")
                                     finally:
                                8
8
                                          print("After")
                                9
```

```
$ python3 16_contextmanager_exceptions.py
Before
Oh no: division by zero
After
```

We made it!



• Do not explicitly re-raise exceptions in __exit__ methods.

- Do not explicitly re-raise exceptions in __exit__ methods.
- In @contextmanagers however you must re-raise.

- Do not explicitly re-raise exceptions in __exit__ methods.
- In @contextmanagers however you must re-raise.
- Know the roles of __init__ and __enter__
 - No side effects in __init__
 - Don't make __init__ too computationally expensive.

Other possible uses!

So many!

Enclose an event and log based on what happens.

Other possible uses!

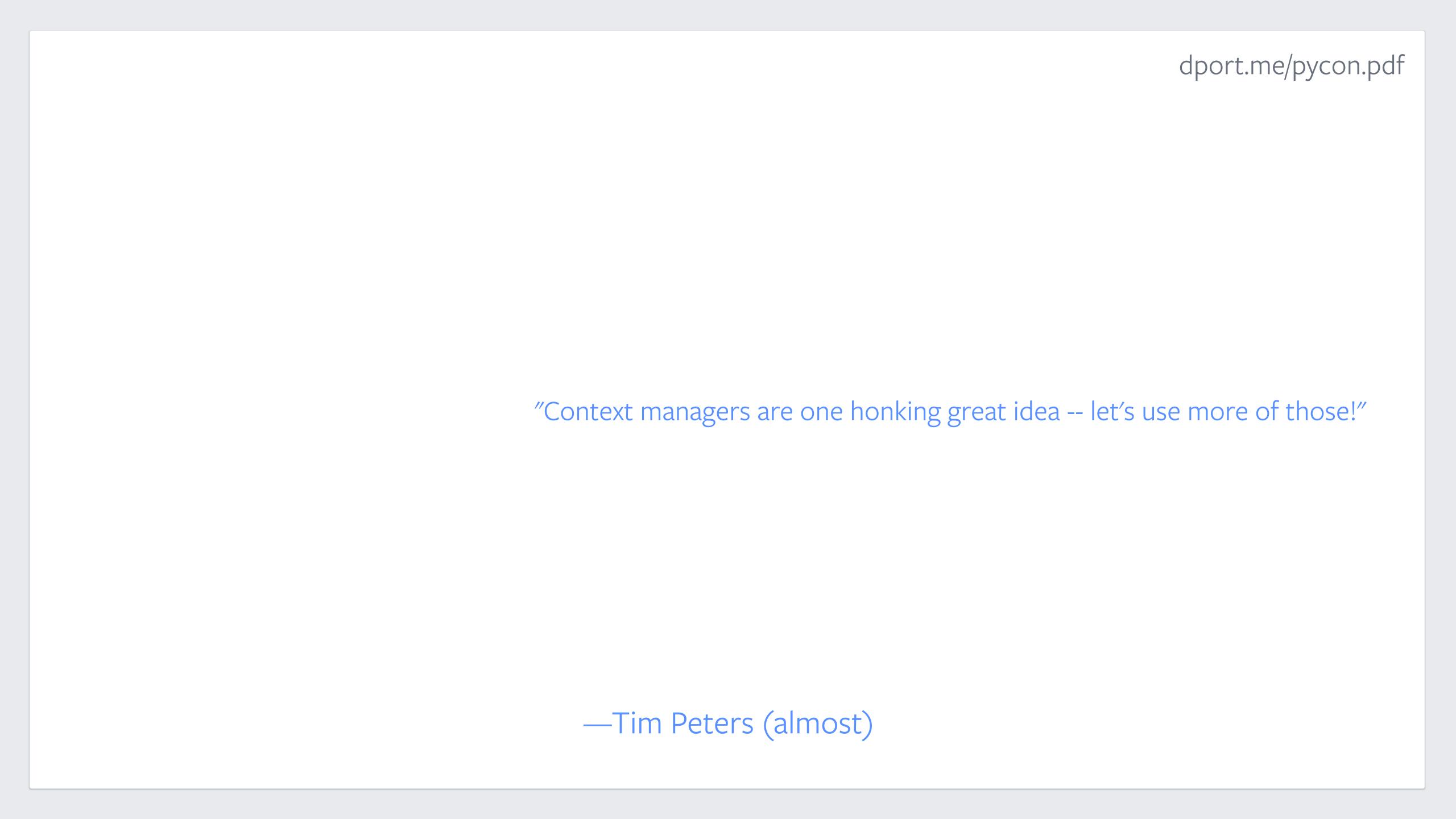
So many!

- Enclose an event and log based on what happens.
- Remote integration tests.

Other possible uses!

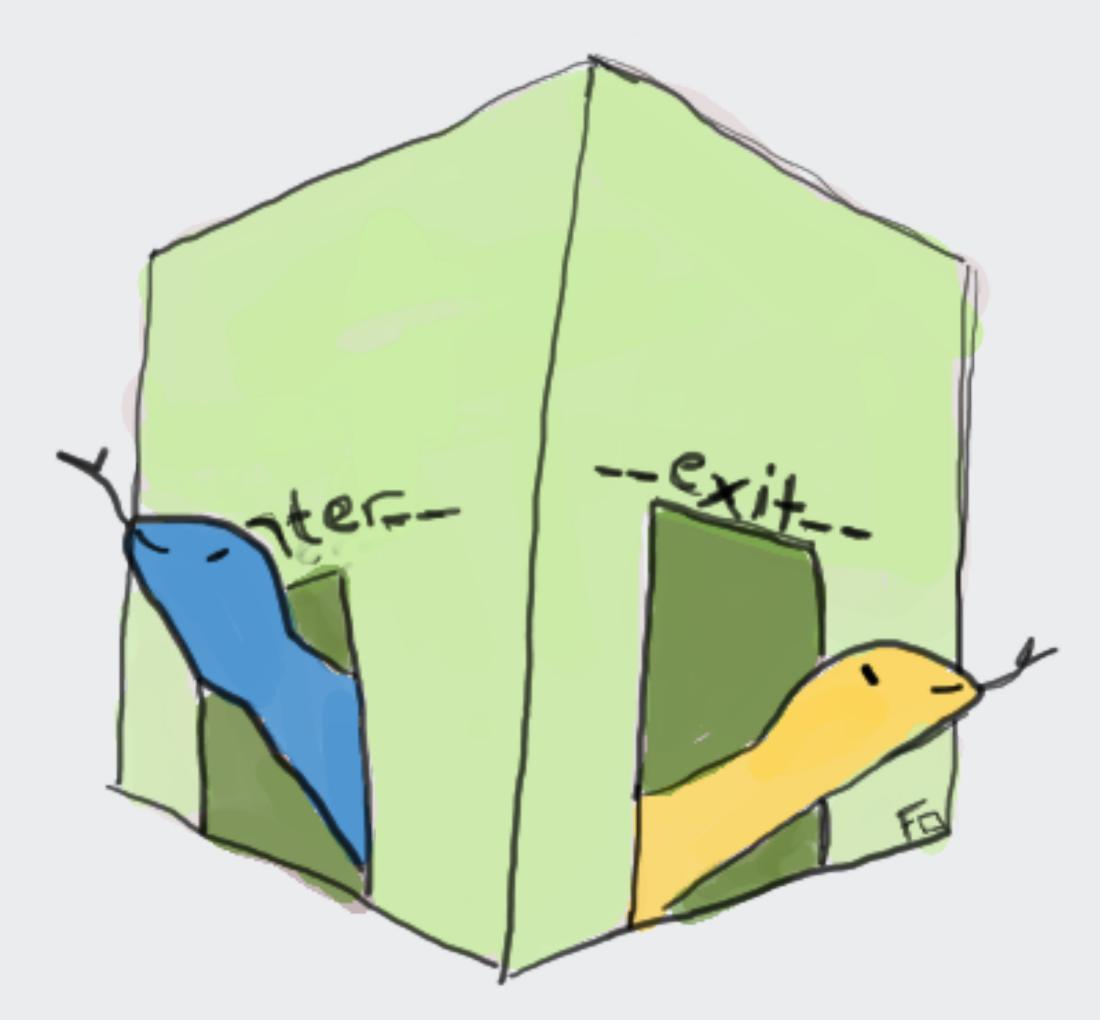
So many!

- Enclose an event and log based on what happens.
- Remote integration tests.
- More!









- @fatty_box

Thanks to these great folks



- · Lachlan, John, Luka, and Sam
 - For watching all my dry-runs
- Fatema and Kelly
 - For drawings and moral support
- The Pycon AU team!!
- All of you lovely people

Questions?

Tweeter

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Key take aways



- Use context managers!
- Context managers are one honking great idea -- let's use more of those!
- Use context managers but bolded!

First, the hard way

But not necessarily the wrong way

e. hmm open is a builtin and threadpoolexecutor is too complex. suppress would necessitate explanation of exception handling

```
Typical usage:
                                        equivalent to this:
    @contextmanager
    def some_generator(<arguments>):
                                             <setup>
        <setup>
                                             try:
        try:
                                                 <variable> = <value>
            yield <value>
                                                 <body>
        finally:
                                             finally:
            <cleanup>
                                                 <cleanup>
This makes this:
    with some_generator(<arguments>) as <variable>:
        <body>
```