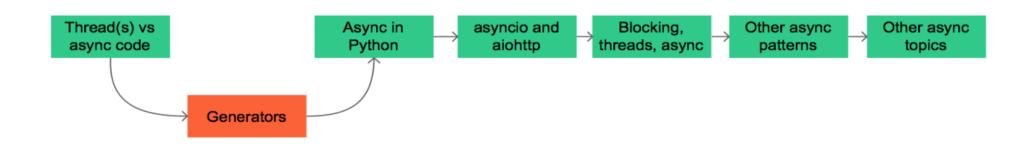


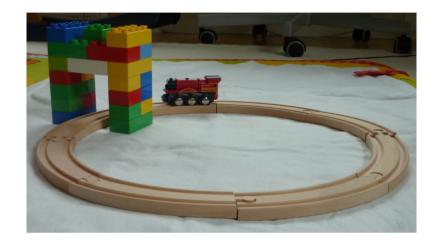
Asynchronous Python





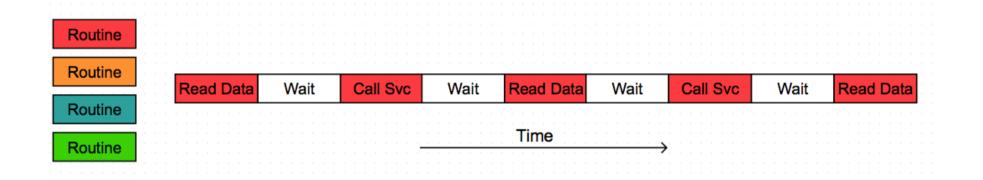
A thread





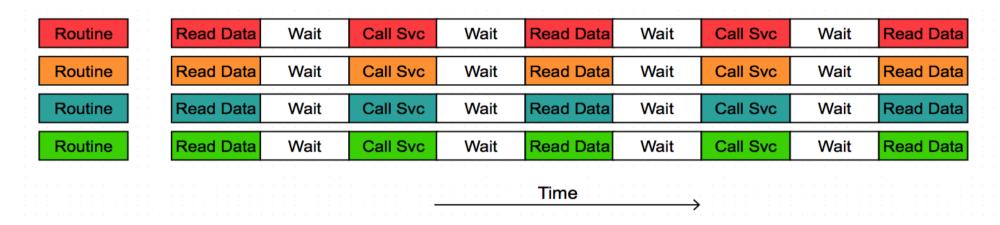
- A thread is like a train
- Length of train is time
- Each car represents an opportunity to execute an instruction
- Empty cars are waste

A thread



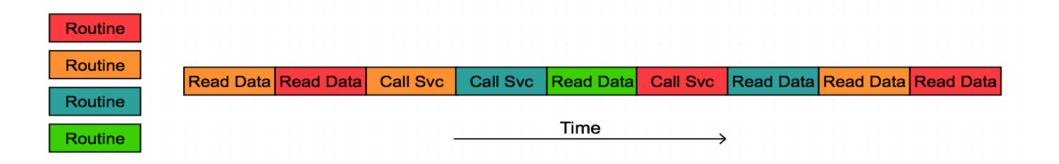
- Single line of execution that processes one instruction at a time
- Blocking of thread occurs on I/O reads
- Waiting for file system, DNS lookup, http server connections and reads

Multiple threads or processes



- Parallel execution of tasks
- More efficient use of time
- But still waste in each thread
- Each thread or process blocks and has a cost
- Python threads and the GIL

Asynchronous



- More efficient use of single thread
- Shelve waiting code so other code may execu
- Fill in the gaps where waits occur



Python generators

- I need a list of numbers
 0 to 9999
- I could create a list of numbers in memory
- But its not very efficient

```
module: nogenerator.py
mem: 516,096
utime: 0.004304
stime: 0.000294
cpu: 0.004598
time: 0.004591
```

```
nogenerator.py
      from resourcehelper import ResourceHelper
      def no_generator(top):
          result = []
          i = 0
          while i < top:
               result.append(i)
              i += 1
          return result
  10
  11
     if __name__ == '__main__':
          rh = ResourceHelper(__file__)
  13
  14
  15
          for i in no_generator(10000):
  16
               pass
  17
          rh.usage()
  18
```

Python generators

- I could also use a generator pattern
- Much more efficient, but lots of code
- Create an iterable object
- Creates data as needed
- Think range(n)

```
module: generator.py
mem: 4,096
utime: 0.001839
stime: 0.000001
cpu: 0.001840
time: 0.001842
```

```
generatorlong.py
     from resourcehelper import ResourceHelper
      class generator(object):
          def __init__(self, top):
              self.top = top
              self.i = 0
          def __iter__(self):
              return self
  10
  11
  12
          def __next__(self):
  13
              c = self.i
              if self.i < self.top:</pre>
  14
                   self.i += 1
  15
  16
                   return c
  17
              else:
  18
                   raise StopIteration()
  19
     if __name__ == '__main__':
          rh = ResourceHelper(__file__)
  21
  22
  23
          for i in generator(10000):
  24
              pass
  25
  26
          rh.usage()
```

Python generators

- Python provides a nice shortcut to create generators
- yield tells thread to return value and shelve code until next call of generator

```
module: generatorlong.py
mem: 4,096
utime: 0.005921
stime: 0.000001
cpu: 0.005922
time: 0.005923
```

```
generator.py
     from resourcehelper import ResourceHelper
     def generator(top):
          i = 0
          while i < top:
              vield i
              i += 1
  10
     if __name__ == '__main__':
          rh = ResourceHelper(__file__)
  12
  13
          for i in generator(10000):
  14
  15
              pass
  16
          rh.usage()
  17
```



asyncio and aiohttp

<u>asyncio</u>

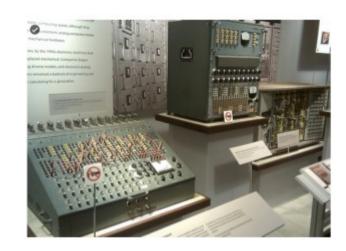
- Introduced in 3.4, derived from tulip project
- Deferred pattern using coroutines, futures and tasks as opposed to callbacks
- Thought is that callbacks can get complicated real quick and hard to read
- Single event loop per thread
- Provides transport library to asynchronous manage connections

<u>aiohttp</u>

- Third party library that provides http protocol support to asyncio
- Sits on to of asyncio transport library
- Think of it as a requests for asyncio

Problem: total .gov jobs in zips

a bunch of zip codes + usajobs.gov = number of jobs



1,706

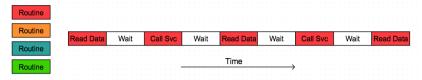
- total_jobs = 0
- loop through all zips
 - call https://data.usajobs.gov/api/jobs?LocationId=' + zip
 - total_jobs = total_jobs + response.number_of_jobs
- print total jobs

Blocking solution

- Single thread, synchronous execution
- Lots of wasted time waiting for usajobs.gov
- Wait for DNS lookup and for a response from server

```
jobs available: 1651

module: block.py
mem: 6,733,824
utime: 3.020994
stime: 0.210687
cpu: 3.231681
time: 41.310599
```



```
1 import json
  import requests
  from resourcehelper import ResourceHelper
6 def get_jobs(zip):
      response = requests.get('https://data.usajobs.gov/api
      result = json.loads(response.text)
      total_jobs = int(result['TotalJobs'])
      return total_jobs
  def block_jobs(zips):
      total = 0
      for zip in zips:
          total += get_jobs(zip)
      return total
  if name == ' main ':
      rh = ResourceHelper(__file__)
      zips = ['79936', '90011', '60629', '90650', '90201',
              '90250', '90280', '11226', '90805', '91331'
              '10467', '92683', '75052', '91342', '92704'
              '75217', '92376', '93307', '10456', '10002'
              '92345', '60618', '93033', '93550', '95076'
              '37211', '30043', '11206', '10453', '92154'
              '92553', '90706', '23464', '11212', '60617'
              '77429', '93535', '66062', '93257', '30349'
              '11207', '77494', '75211', '11234', '28269'
              '92509', '77083', '91335', '85364', '87121',
      jobs = block_jobs(zips)
      print('\njobs available: %s' % jobs)
                                                            12
      rh.usage()
```

Threaded solution

- Spin a thread for each lookup
- As threads end capture result
- For I/O operations very fast but can use a lot of memory
- For CPU operations GIL will block

```
jobs available: 1651

module: threaded.py
mem: 91,996,160
utime: 2.784083
stime: 1.149400
cpu: 3.933483
time: 2.720289
```

| Routine | |
|---------|--|
| _ | |
| Routine | |
| _ | |
| Routine | |
| | |
| Routine | |

| Read Data | Wait | Call Svc | Wait | Read Data | Wait | Call Svc | Wait | Read Data |
|-----------|------|----------|------|-----------|------|----------|------|-----------|
| Read Data | Wait | Call Svc | Wait | Read Data | Wait | Call Svc | Wait | Read Data |
| Read Data | Wait | Call Svc | Wait | Read Data | Wait | Call Svc | Wait | Read Data |
| Read Data | Wait | Call Svc | Wait | Read Data | Wait | Call Svc | Wait | Read Data |

Time

```
threaded.pv
   1 from threading import Thread
   2 import ison
     import requests
     from resourcehelper import ResourceHelper
     class GetJobs(Thread):
         def __init__(self, zip):
             super(GetJobs, self).__init__()
             self.zip = zip
             self.total_jobs = 0
         def run(self):
             response = requests.get('https://data.usajobs.go
             result = json.loads(response.text)
             self.total_jobs = int(result['TotalJobs'])
  20 def thread_jobs(zips):
         total = 0
         threads = []
         for zip in zips:
              threads.append(GetJobs(zip))
             threads[-1].start()
         for t in threads:
             t.join()
             total += t.total_jobs
         return total
  35 if __name__ == '__main__':
         rh = ResourceHelper(__file__)
         zips = ['79936', '90011', '60629', '90650', '90201'
                  '90250', '90280', '11226', '90805', '91331
```

Async solution

Routine
Routine
Routine



- Event loop is created and passed a coroutine
- coroutine is a generator that wraps a function, it makes it event loop aware
- coroutines return futures
- A future represents a future result, think deferred
- yield from used to handle future of coroutine
- yield from tells the loop to shelve a coroutine until its ready
- coroutines may be stacked on top of one another, results can bubble up

jobs available: 1651

module: async.py
mem: 12,185,600
utime: 0.627300
stime: 0.083406
cpu: 0.710706
time: 3.852678



```
1 import asyncio
   import aiohttp
   from resourcehelper import ResourceHelper
   @asyncio.coroutine
   def get_jobs(zip):
       response = yield from aiohttp.request('GET', 'https://data.usa
       result = yield from response.read and close(decode=True)
       total_jobs = int(result['TotalJobs'])
       return total jobs
11
12
13
   @asyncio.coroutine
15 def async_jobs(zips):
       total = 0
       coroutines = [get_jobs(zip) for zip in zips]
       for result in asyncio.as_completed(coroutines):
           total += yield from result
       return total
21
22
23 if __name__ == '__main__':
       rh = ResourceHelper( file )
24
25
       zips = ['79936', '90011', '60629', '90650', '90201', '77084'
               '92509', '77083', '91335', '85364', '87121', '10468'
27
       loop = asyncio.get event loop()
       jobs = loop.run until complete(async jobs(zips))
       print('\njobs available: %s' % jobs)
32
       rh.usage()
```

Event Loop

- Is a loop that facilitates the sharing of computing resources by coroutines
- One loop per thread, so typically a single loop
- May be created and retrieved by .get_event_loop(), typically in main()
- Only the main thread may do this, other threads must create their own and use .set_event_loop() before the get
- Ex. .run_until_complete(future) to start our loop OR .run_forever() + .stop()
- Callbacks within loop using .call_soon(cb, args), .call_later(), .call_at()

```
36
37    loop = asyncio.get_event_loop()
38    jobs = loop.run_until_complete(async_jobs(zips))
39    print('\njobs available: %s' % jobs)
40
```

```
import asyncio

def work_callback(result, loop):
    print('ending loop for result: {}'.format(result))
    loop.stop()

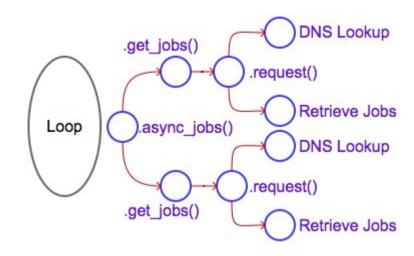
def do_some_work(x, y, cb, loop):
    r = x + y
    loop.call_later(3, cb, r, loop)

if __name__ == '__main__':
    loop = asyncio.get_event_loop()
    loop.call_soon(do_some_work, 2, 3, work_callback, loop)
    jobs = loop.run_forever()
```



Coroutine

- Is a generator that wraps a function, made to be event loop aware
- As a generator they return a computed value
- A future represents a future result, think deferred
- Coroutines return futures, either not done or done with result
- If done code block continues, if not done continue to shelve coroutine
- yield from identifies a coroutine
- yield from used to handle future of called coroutine
- yield from tells the loop to shelve a coroutine until its ready
- "pretend that yield from isn't there"



```
@asyncio.coroutine
7 def get jobs(zip):
       response = yield from aiohttp.request('GET', 'https://dat
       result = yield from response.read_and_close(decode=True)
       total_jobs = int(result['TotalJobs'])
       return total_jobs
11
12
13
   @asyncio.coroutine
15
   def async_jobs(zips):
       total = 0
17
       coroutines = [get_jobs(zip) for zip in zips]
       for result in asyncio.as completed(coroutines):
18
19
           total += yield from result
       return total
```

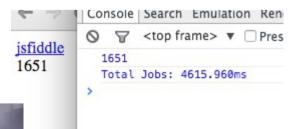


Blocking vs Async

```
block.py
   1 import ison
                                                           1 import asyncio
   2 import requests
                                                             import aiohttp
   3 from resourcehelper import ResourceHelper
                                                           3 from resourcehelper import ResourceHelper
   6 def get_jobs(zip):
                                                          6 @asyncio.coroutine
         response = requests.get('https://data.usajob
                                                          7 def get jobs(zip):
         result = json.loads(response.text)
                                                                 response = yield from aiohttp.request('GET', 'https://data
                                                                 result = vield from response.read and close(decode=True)
          total jobs = int(result['TotalJobs'])
                                                                 total jobs = int(result['TotalJobs'])
          return total jobs
                                                                 return total jobs
  12
  13 def block jobs(zips):
         total = 0
                                                          14 @asyncio.coroutine
                                                         15 def async_jobs(zips):
         for zip in zips:
              total += get_jobs(zip)
                                                                 total = 0
          return total
                                                                 coroutines = [get_jobs(zip) for zip in zips]
                                                                 for result in asyncio.as_completed(coroutines):
                                                                     total += yield from result
  20 if name == ' main ':
                                                                 return total
         rh = ResourceHelper(__file__)
         zips = ['79936', '90011', '60629', '90650',
                                                         23 if name == ' main ':
                  '90250', '90280', '11226', '90805',
                                                                 rh = ResourceHelper(__file__)
                  '10467', '92683', '75052', '91342',
                  '75217', '92376', '93307', '10456',
                                                                 zips = ['79936', '90011', '60629', '90650', '90201', '7708
                                                                         '92509', '77083', '91335', '85364', '87121', '1046
                  '92345', '60618', '93033', '93550',
                  '37211', '30043', '11206', '10453',
                  '92553', '90706', '23464', '11212',
                                                                 loop = asyncio.get_event_loop()
                  '77429', '93535', '66062', '93257',
                                                                 jobs = loop.run_until_complete(async_jobs(zips))
                  '11207', '77494', '75211', '11234',
                                                                 print('\njobs available: %s' % jobs)
                  '92509', '77083', '91335', '85364',
                                                                 rh.usage()
         jobs = block_jobs(zips)
         print('\njobs available: %s' % jobs)
         rh.usage()
```

JavaScript

- JavaScript is single threaded
- I/O operations are asynchronous
- Callbacks used to identify follow up code execution
- Easy to end up with multipulation nested callbacks
- JQuery deferreds and ES promises



thise lement.addEventLis**'ceio & 'f**(unction(){alert('fail); **e**);

```
1 <!DOCTYPE html>
   <html>
   <head>
       <link rel="shortcut icon" href="data:image/x-icon;," type="image/x-icon">
       <script src="https://ajax.googleapis.com/ajax/libs/jquery/2.1.3/jquery.min.js"></scr</pre>
   </head>
9 <body>
       <a target="_blank" href="http://jsfiddle.net/scottumsted/866sx7he/1/">jsfiddle</a>
       <div id="total_jobs"></div>
       <script>
           function start() {
               console.time('Total Jobs');
               zips = ['79936', '90011', '60629', '90650', '90201', '77084', '92335', '7852
                        '92509', '77083', '91335', '85364', '87121', '10468', '90255', '9306
               var deferreds = [];
               for (var i in zips) {
                   var url = 'https://data.usajobs.gov/api/jobs?LocationId=' + zips[i];
                   deferreds.push($.getJSON(url));
               $.when.apply('$', deferreds).then(function () {
                   var totalJobs = 0;
                   for (var i in arguments) {
                        totalJobs += parseInt(arguments[i][0].TotalJobs);
                   $('#total jobs').html(totalJobs);
                   console.log(totalJobs);
                   console.timeEnd('Total Jobs');
               });
           $().ready(start);
       </script>
38 </body>
```

Other Resources

- Guido –https://youtu.be/1coLC-MUCJc
- https://docs.python.org/3.4/library/asyncio.html
- https://www.python.org/dev/peps/pep-3156/
- http://www.drdobbs.com/open-source/the-new-asyncio-module-in-p thon-34-even/240168401
- https://wiki.python.org/moin/Generators