



Async Python. Who's  
there? Knock knock.

Parallelism, concurrency,  
multi-processing, threading,  
oh my! 



Parallelism: performing multiple operations at the same time.



Concurrency: performing multiple operations in an overlapping manner.

# As David said earlier today...

"Nobody uses threads to make their applications less buggy or more stable."

-- [@DavidOstrovsky](#) #confoo



Async I/O: a style of concurrent programming in which tasks release the CPU during idling periods, so that other tasks can use it.

# Which model is the best?

# It depends...

1. heavy computations or maths (CPU bound)
  - multi-processing
2. network, servers, HTTP, sockets (I/O bound)
  - multi-threading
  - asyncio

# How does asyncio work?



**Marc Aubé** @maaube 12 m  
Hey @miguelgrinberg 🙌 I was wondering if I could borrow your Judit Polgár example, for a talk on asyncio. I think it beautifully illustrates cooperative concurrency. Obviously, I'd give credit for the analogy.



**Miguel Grinberg**  
@miguelgrinberg

@maaube Yes, I have no problem with that! Send me a link to your talk if it makes it to youtube!



@maaube

# Chess Exhibition



- Assumptions
  - 24 opponents
  - Polgár moves in 5 seconds
  - Opponents move in 55 seconds
  - Games average 30 move pairs
  - Each game runs for 30 minutes



## Synchronous Chess Exhibition

- Judit plays one game at a time
- Each game runs for 30 minutes
- There are 24 games to play
- 24 sequential games would take:  
 $24 \times 30 \text{ min} = 720 \text{ min} = \underline{12 \text{ hours}}$



## Asynchronous Chess Exhibition

- Polgár makes a move
- While the opponent thinks, she moves on the second game, then third, ...
- A move on all 24 games takes her:  
 $24 \times 5 \text{ sec} = 120 \text{ sec} = \underline{2 \text{ minutes}}$
- 24 games are completed in:  
 $2 \text{ min} \times 30 = 60 \text{ min} = \underline{1 \text{ hour!}}$



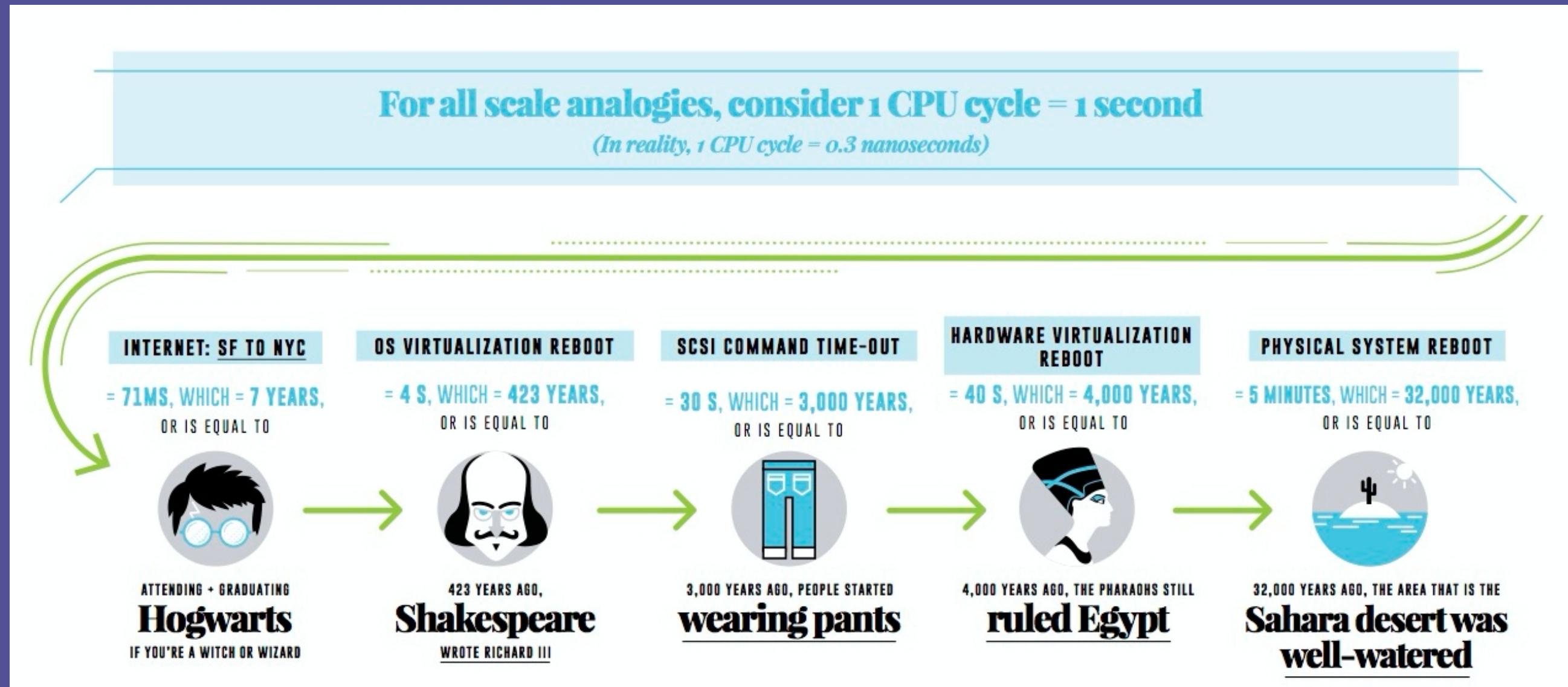
## Asynchronous Chess Exhibition

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# Cooperative concurrency

A fancy way of saying that your async functions can give back control to the execution loop, *so that each function can run at the optimal time.*

# Understanding computer time



# async and await



```
1 import asyncio
2
3 async def hello():
4     print("Hello")
5     await asyncio.sleep(1)
6     print("World!")
```



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```
1 import asyncio
2
3 async def hello():
4     print("Hello")
5     await asyncio.sleep(1)
6     print("World!")
7
8 async def main():
9     await asyncio.gather(hello(), hello(), hello())
10
11 if __name__ == "__main__":
12     asyncio.run(main())
```



1 Hello

2 Hello

3 Hello

4 World!

5 World!

6 World!



```
1 import asyncio
2
3 async def hello():
4     print("Hello")
5     await asyncio.sleep(1)
6     print("World!")
7
8 async def main():
9     await asyncio.gather(hello(), hello(), hello())
10
11 if __name__ == "__main__":
12     asyncio.run(main())
```

async\_hello.py executed in 1.01 seconds.

# Made-up problem time!

# Goals

1. Crawl Confoo's Flickr account
2. Download all pictures from photo stream
3. Make a 120x120 thumbnail for each of them
4. Convert it to black & white
5. Be fast! 🏍️



```
1 async def main():
2     pages = [
3         f'https://www.flickr.com/photos/confoo/page{i}'
4         for i in range(1, 100)
5     ]
6
7     # TODO: crawl pages, find images, download and process them.
```



```
1 import aiohttp
2
3 async def fetch_html(url):
4     async with aiohttp.ClientSession() as session:
5         response = await session.get(url, allow_redirects=False)
6
7     if response.status != 200:
8         return ''
9
10    return await response.text()
```



```
1 import aiohttp
2
3 IMG_PATTERN = re.compile(r'url\:\/\/(live.staticflickr\.com\.\.\.jpg)\)')
4
5 async def fetch_html(url, session):
6     # ...
7
8 async def find_images_in_page(url, session):
9     async with aiohttp.ClientSession() as session:
10         html = await fetch_html(url, session)
11
12         images = set()
13         for img_url in IMG_PATTERN.findall(html):
14             images.add(f'https://{{img_url}}')
15
16     return images
```



```
1 async def fetch_html(url, session):
2     # ...
3
4 async def find_images_in_page(url, session):
5     # ...
6
7 async def find_all_images(urls):
8     async with aiohttp.ClientSession() as session:
9         tasks = []
10        for url in urls:
11            tasks.append(find_images_in_page(url, session))
12
13    return await asyncio.gather(*tasks)
```



```
1 import itertools
2
3 def flatten(iterable):
4     return list(itertools.chain.from_iterable(iterable))
5
6 async def find_all_images(urls):
7     async with aiohttp.ClientSession() as session:
8         # ...
9
10    return flatten(await asyncio.gather(*tasks))
```



```
1 async def main():
2     pages = [
3         f'https://www.flickr.com/photos/confoo/page{i}'
4         for i in range(1, 100)
5     ]
6
7     images = await find_all_images(pages)
8     print(f'[+] Found {len(images)} images.')
9
10    # TODO: download images and process them.
11
12 if __name__ == '__main__':
13     asyncio.run(main())
```



```
1 from io import BytesIO
2 from PIL import Image
3
4 def process_image(bytes, filename):
5     img = Image.open(BytesIO(bytes))
6     img = img.resize((120, 120))
7     img = img.convert("L")
8     img.save(f'images/{filename}')
```

This function is blocking...



```
1 import asyncio
2 from concurrent.futures.thread import ThreadPoolExecutor
3 from functools import partial
4
5 thread_pool = ThreadPoolExecutor()
6
7 def process_image(bytes, filename):
8     # ...
9
10 async def async_process_image(bytes, filename):
11     loop = asyncio.get_event_loop()
12
13     await loop.run_in_executor(
14         thread_pool,
15         partial(process_image, bytes, filename)
16     )
```



```
1 def process_image(bytes, filename):
2     # ...
3
4 async def async_process_image(bytes, filename):
5     # ...
6
7 async def download_image(url):
8     filename = url.split('/')[-1]
9
10    async with aiohttp.ClientSession() as session:
11        async with session.get(url) as resp:
12            if resp.status == 200:
13                await async_process_image(await resp.read(), filename)
```



```
1 def process_image(bytes, filename):
2     # ...
3
4 async def async_process_image(bytes, filename):
5     # ...
6
7 async def download_image(url, session):
8     # ...
9
10 async def download_images(urls):
11     async with aiohttp.ClientSession() as session:
12         tasks = []
13         for url in urls:
14             tasks.append(download_image(url, session))
15
16     await asyncio.gather(*tasks)
```



```
1 async def main():
2     pages = [
3         f'https://www.flickr.com/photos/confoo/page{i}'
4         for i in range(1, 100)
5     ]
6
7     images = await find_all_images(pages)
8     print(f'[+] Found {len(images)} images.')
9
10    await download_images(images)
11    print(f'[+] Processed all {len(images)} images.')
12
13 if __name__ == '__main__':
14     asyncio.run(main())
```

# Goals

1. Crawl Confoo's Flickr account ✓
2. Download all pictures from photo stream ✓
3. Make a 120x120 thumbnail for each of them ✓
4. Convert it to black & white ✓
5. Be fast! ?



```
1 [-] Found 481 images.  
2 [-] Processed all 481 images.  
3  
4 [!] Script executed in 6.52 seconds.
```

# Going even faster!





```
1 async def main():
2     pages = [
3         f'https://www.flickr.com/photos/confoo/page{i}'
4         for i in range(1, 100)
5     ]
6
7     q = asyncio.Queue()
8
9     # Create one "producer" for every page, that will add image URLs to the
10    Queue
11    producers = [
12        asyncio.create_task(find_images_in_page(url, q))
13        for url in pages
14    ]
15
16    # Create 10 consumers, that will process images as soon as they're
17    # available
18    consumers = [
19        asyncio.create_task(download_image(q))
20        for _ in range(10)
21    ]
22
23    await asyncio.gather(*producers)
24    await q.join() # Implicitly awaits consumers, too
25    for c in consumers:
26        c.cancel()
27
28 if __name__ == '__main__':
29     asyncio.run(main())
```

# GitHub repo



# Pitfalls

- long CPU-intensive tasks
  - execute in a background thread
  - routinely release CPU with `await asyncio.sleep(0)`
- blocking library functions

# Resources

# Awesome asyncio



awesome

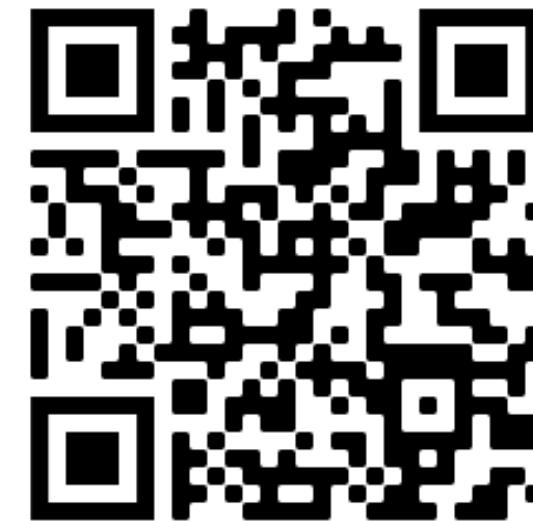
A carefully curated list of awesome Python asyncio frameworks, libraries, software and resources.

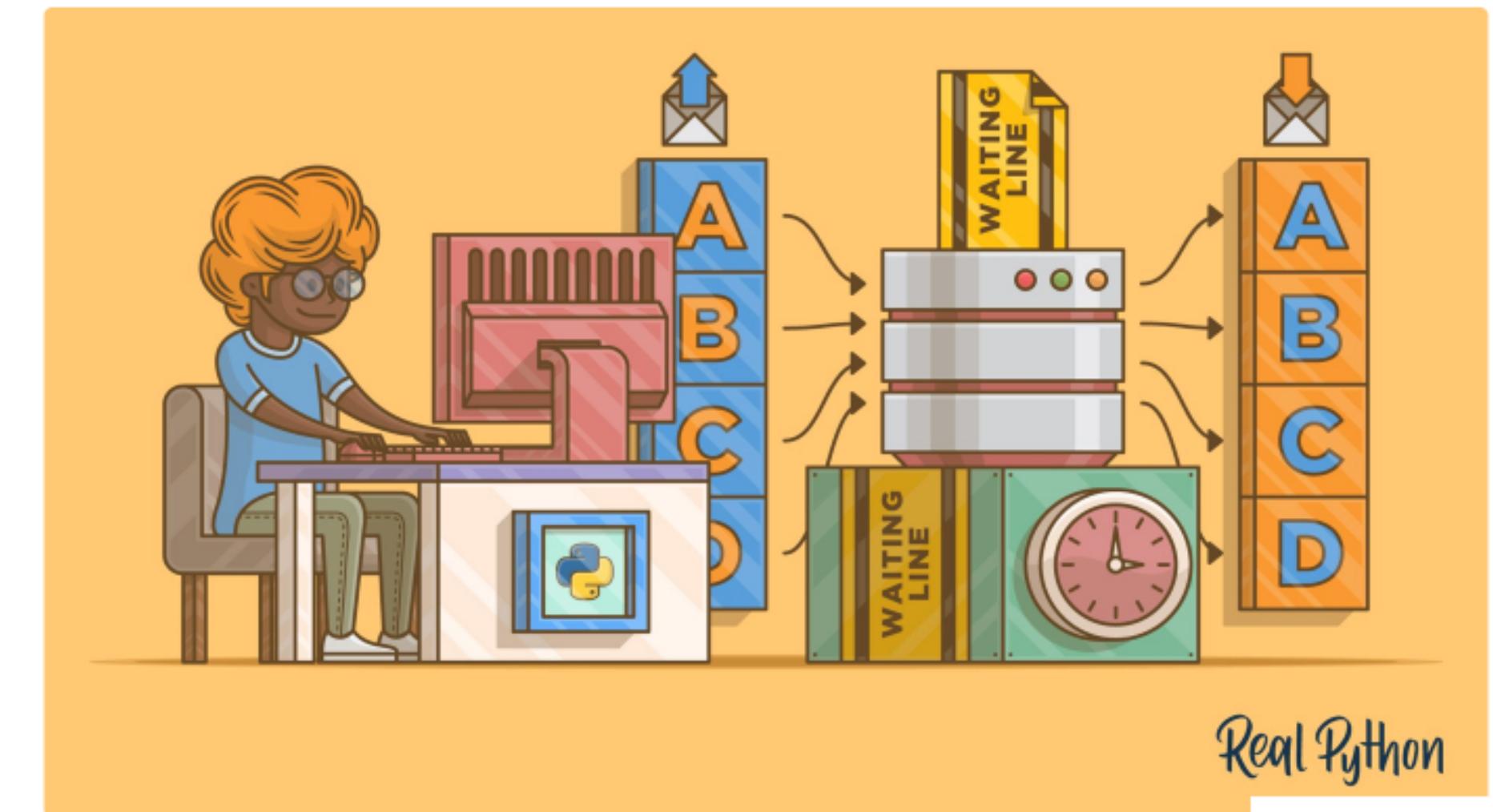
The Python [asyncio](#) module introduced to the standard library with Python 3.4 provides infrastructure for writing single-threaded concurrent code using coroutines, multiplexing I/O access over sockets and other resources, running network clients and servers, and other related primitives.

Asyncio is not really a brand-new technology however it appears to be very trending since a few years - especially in the Python community and with the release of Python 3.4 in March 2014. Thus, it's pretty hard to keep yourself up-to-date with the most awesome packages out there. Find some of those awesome packages here and if you are missing one we count on you to [create an Issue or a Pull Request](#) with your suggestion.

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# Async IO in Python: A Complete Walkthrough

by Brad Solomon  36 Comments  intermediate  python



# Questions ?