

# Abstracting Concurrency

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# Abstracting Concurrency Mechanisms

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```
import threading
```

```
def sayhello():  
    print("hello from {}".format(threading.current_thread().name))  
    return
```

```
t = threading.Thread(target=sayhello)  
t.start()  
t.join()
```



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num_threads = 4
threads = []
for _ in range(num_threads):
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    t.start()
    threads.append(t)

[t.join() for t in threads]
```





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    t.start()
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[t.join() for t in threads]
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```
import multiprocessing, os

def sayhello():
    print("hello from {}".format(os.getpid()))
    return

if __name__ == '__main__':
    p = multiprocessing.Process(target=sayhello)
    p.start()
    p.join()
```

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import multiprocessing, os

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if __name__ == '__main__':
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if __name__ == '__main__':
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        p.start()
        processes.append(p)

[p.join() for p in processes]
```

- **Define Task**

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import threading

def sayhello():
    print("hello from {}".format(threading.current_thread().name))
    return

t = threading.Thread(target=sayhello)
t.start()
t.join()
```

```
import multiprocessing, os

def sayhello():
    print("hello from {}".format(os.getpid()))
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if __name__ == '__main__':
    p = multiprocessing.Process(target=sayhello)
    p.start()
    p.join()
```





- Define Task
- **Pass to Executor**

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import threading

def sayhello():
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t.start()
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```

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def sayhello():
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if __name__ == '__main__':
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```



- Define Task
- Pass to Executor
- **Get Results**

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def sayhello():
    print("hello from {}".format(threading.current_thread().name))
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t = threading.Thread(target=sayhello)
t.start()
t.join()
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```
import multiprocessing, os

def sayhello():
    print("hello from {}".format(os.getpid()))
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if __name__ == '__main__':
    p = multiprocessing.Process(target=sayhello)
    p.start()
    p.join()
```



```
def sayhello(name):  
    print("hello from {}".format(name))  
    return
```

```
executor = # new threadpool or processpool instance  
future_result = executor.submit(sayhello, "Tim")
```




```
def sayhello(name):  
    print("hello from {}".format(name))  
    return
```

```
executor = # new threadpool or processpool instance  
names = ["Tim", "Sarah", "Robert"]  
results = executor.map(sayhello, names)
```



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```



```
names = ["Tim", "Sarah", "Robert"]  
threads = []  
for name in range(names):  
    t = threading.Thread(target=sayhello, arg=(name,))  
    t.start()  
    threads.append(t)  
  
[t.join() for t in threads]
```



```
def sayhello(name):  
    print("hello from {}".format(name))  
    return  
  
executor = #  
names = ["Tim", "Sarah", "Robert"]  
results = executor.map(sayhello, names)
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```
def sayhello(name):  
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def sayhello(name):  
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executor = # new processpool instance  
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# Reasons to Switch Executors?



# Reasons to Switch Executors?

- Tasks mix IO and CPU



# Reasons to Switch Executors?

- Tasks mix IO and CPU
- Change of platforms



# The Executor API

---



# Executor Methods

```
submit(fn, *args, **kwargs) # schedules a function to run
```



# Executor Methods

```
map(func, *iterables, timeout=None, chunksize=1)
```



# Executor Methods

```
map(func,  
    *iterables,  
    timeout=None, # how long to wait for a task to complete  
    chunksize=1)
```



# Executor Methods

```
map(func,  
    *iterables,  
    timeout=None,  
    chunksize=1) # how chop up the iterable per worker
```





# Executor Methods

```
shutdown(wait=True) # stop accepting tasks and shutdown
```



# Executor Methods

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```



# Executor Methods

```
with executor:  
    ...use executor...  
    # no need to call shutdown
```



# Executor Subclass



# Executor Subclass

- ThreadPoolExecutor



# Executor Subclass

- ThreadPoolExecutor
- ProcessPoolExecutor



# Executor Subclass

```
ThreadPoolExecutor(max_workers=None, thread_name_prefix="")
```



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# Executor Subclass

```
ThreadPoolExecutor(max_workers=None, thread_name_prefix="")
```



```
from concurrent.futures import ThreadPoolExecutor
from urllib.request import urlopen

def load_url(url, timeout):
    with urlopen(url, timeout=timeout) as conn:
        return conn.read()

with ThreadPoolExecutor(max_workers=2) as executor:
    url1 = "http://www.cnn.com/"
    url2 = "http://www.some-made-up-domain.com/"
    f1 = executor.submit(load_url, url1, 60)
    f2 = executor.submit(load_url, url2, 60)

    try:
        data1 = f1.result()
        print("{} page is {} bytes".format(url1, len(data1)))
        data2 = f2.result()
        print("{} page is {} bytes".format(url2, len(data2)))
    except Exception as ex:
        print("Exception downloading page " + str(ex))
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    f1 = executor.submit(load_url, url1, 60)
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```
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```

```
    try:
```

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        data1 = f1.result()
```

```
        print("{} page is {} bytes".format(url1, len(data1)))
```

```
        data2 = f2.result()
```

```
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```

```
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        data1 = f1.result()
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```
        print("{} page is {} bytes".format(url1, len(data1)))
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```
        data2 = f2.result()
```

```
        print("{} page is {} bytes".format(url2, len(data2)))
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    except Exception as ex:
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# Executor Subclass

```
ProcessPoolExecutor(max_workers=None)
```





# Executor Subclass

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```
from concurrent.futures import ProcessPoolExecutor
import hashlib
```

```
texts = [b"the quick brown fox jumped over the lazy dog",
         b"the big fat panda sat on the hungry snake",
         b"the slick mountain lion ran up the tall tree"]
```

```
def generate_hash(text):
    return hashlib.sha384(text).hexdigest()
```

```
if __name__ == '__main__':
    with ProcessPoolExecutor() as executor:
        for text, hash_t in zip(texts, executor.map(generate_hash, texts)):
            print('%s hash is: %s' % (text, hash_t))
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```



# Future Object

---





# Future

An object that acts as a proxy for a result that is yet to be computed



# Asynchronous Programming

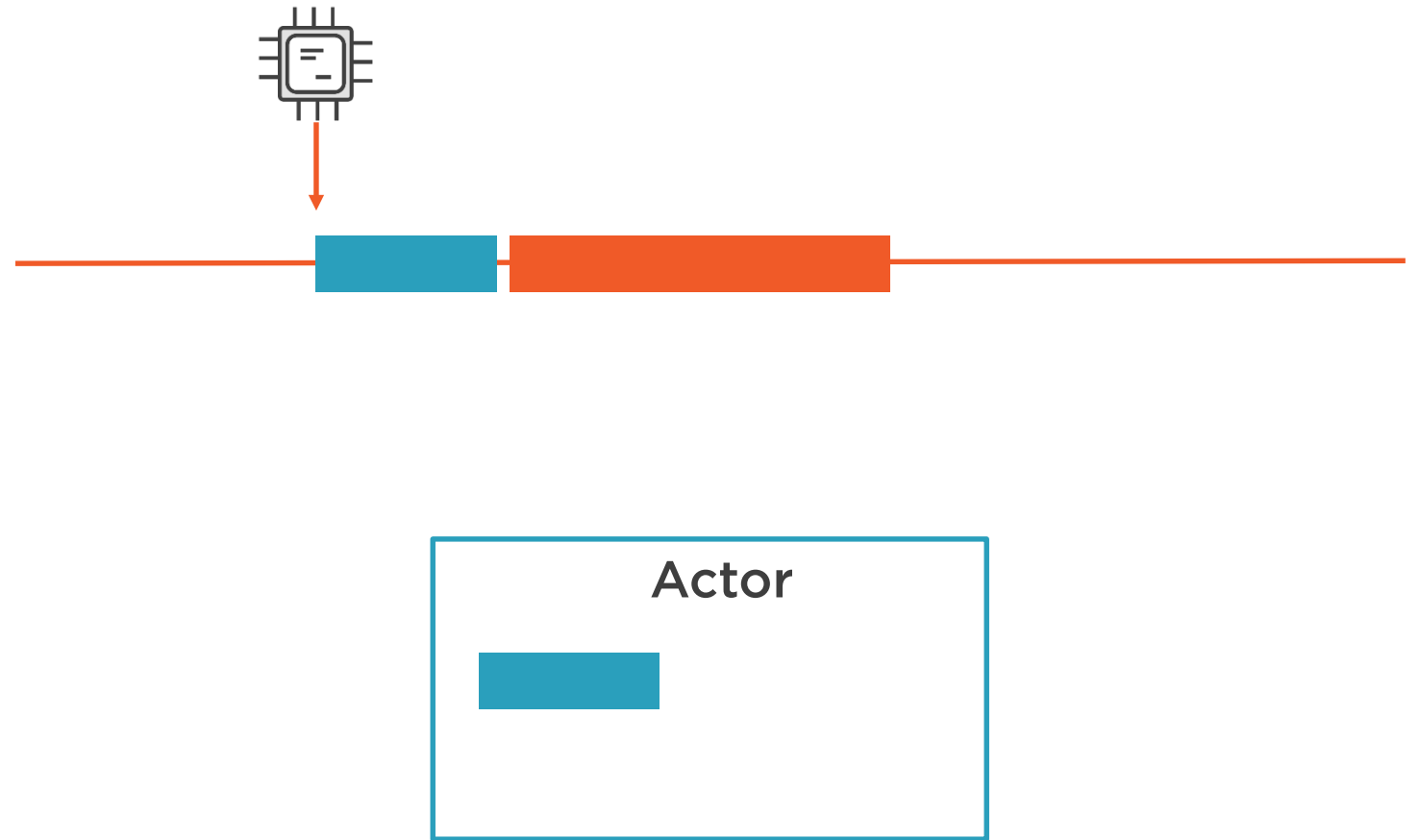
---



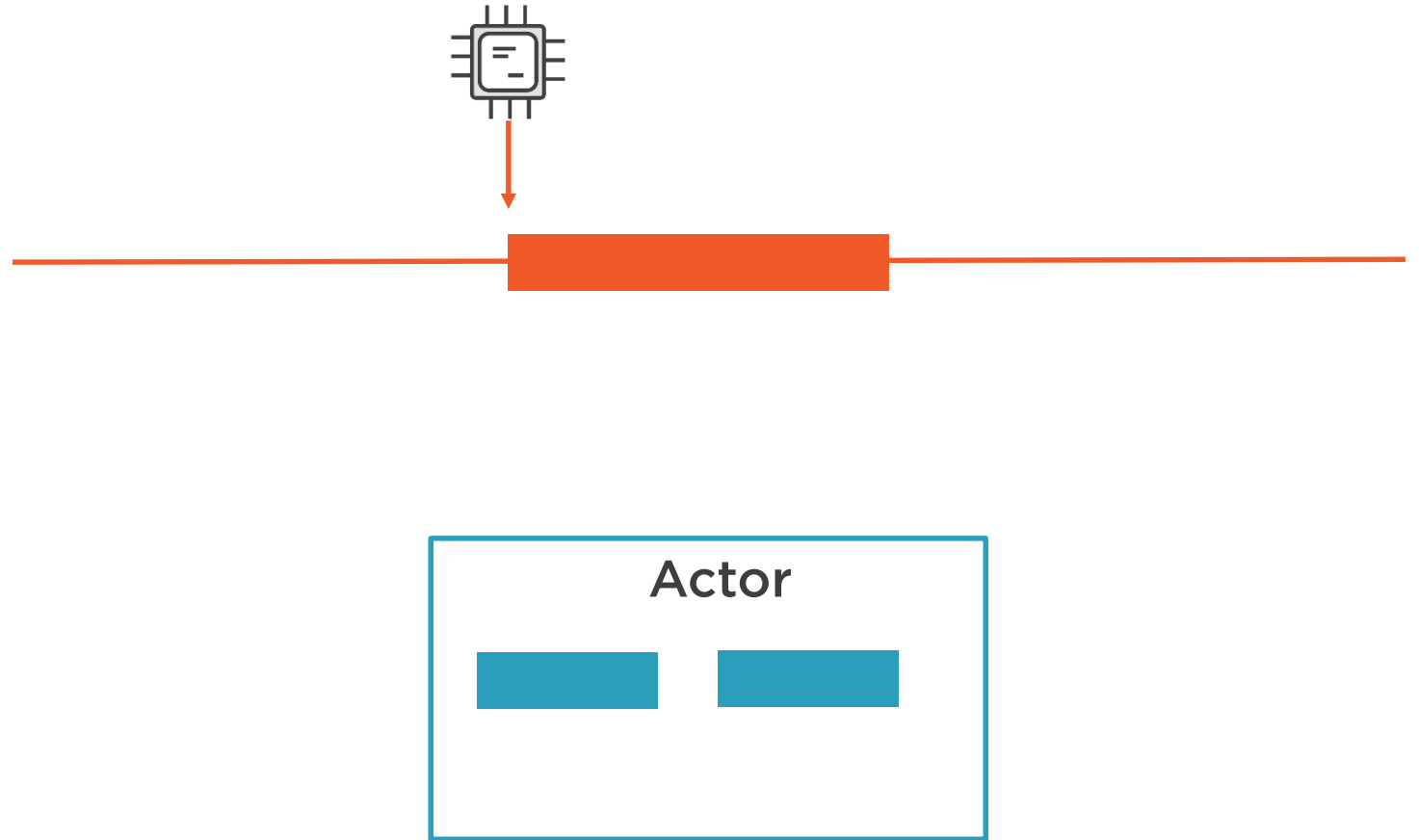
# Asynchronous Programming



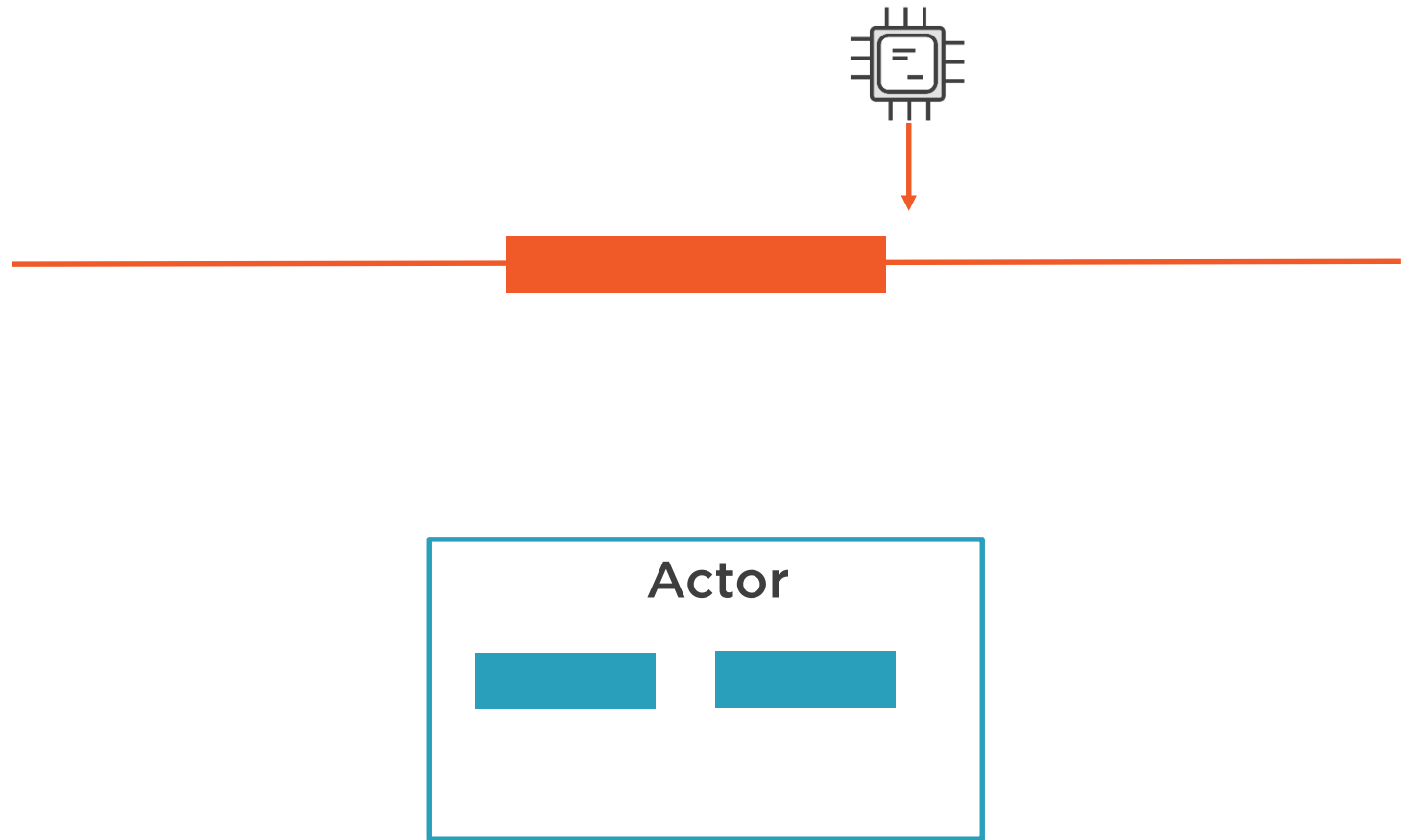
# Asynchronous Programming



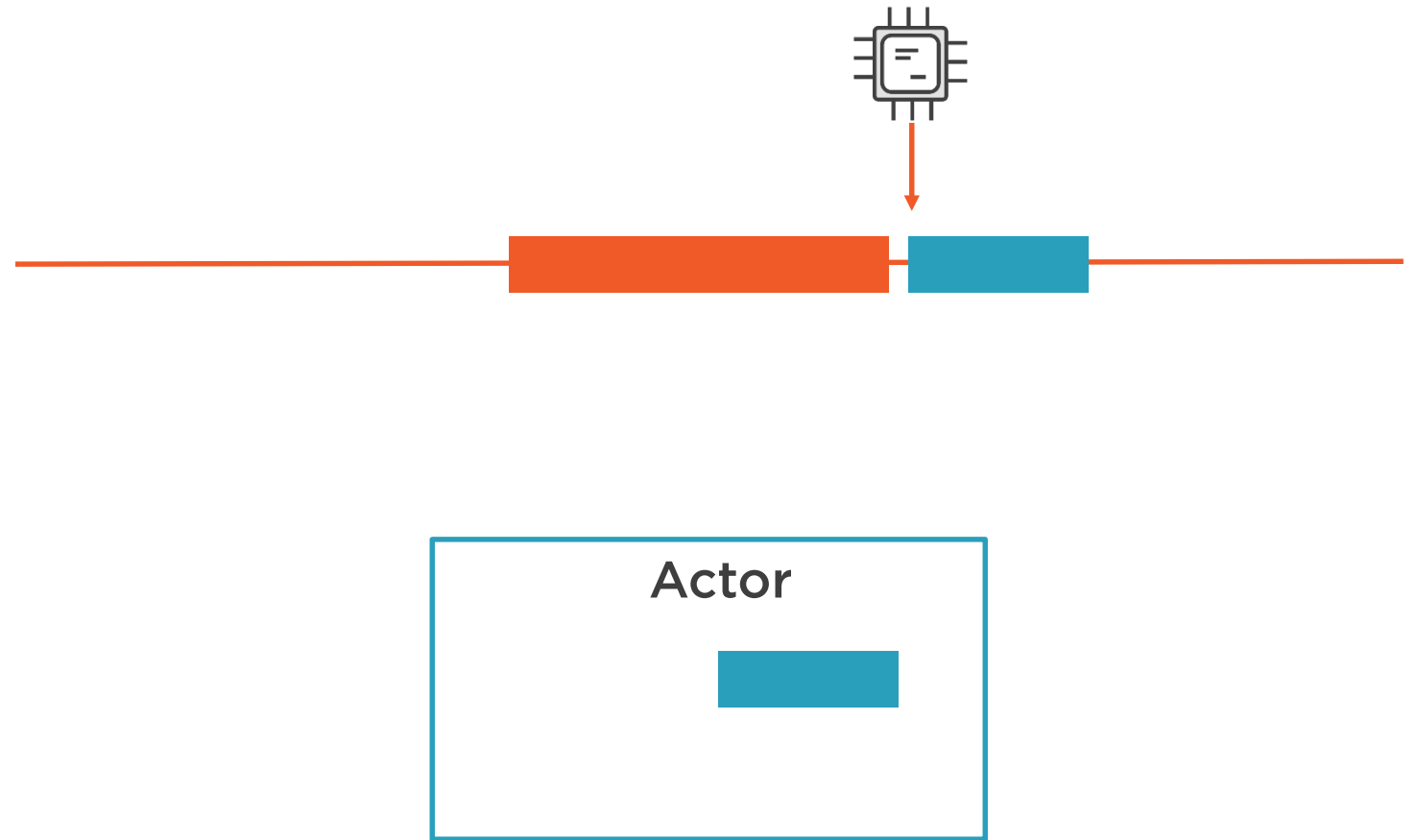
# Asynchronous Programming



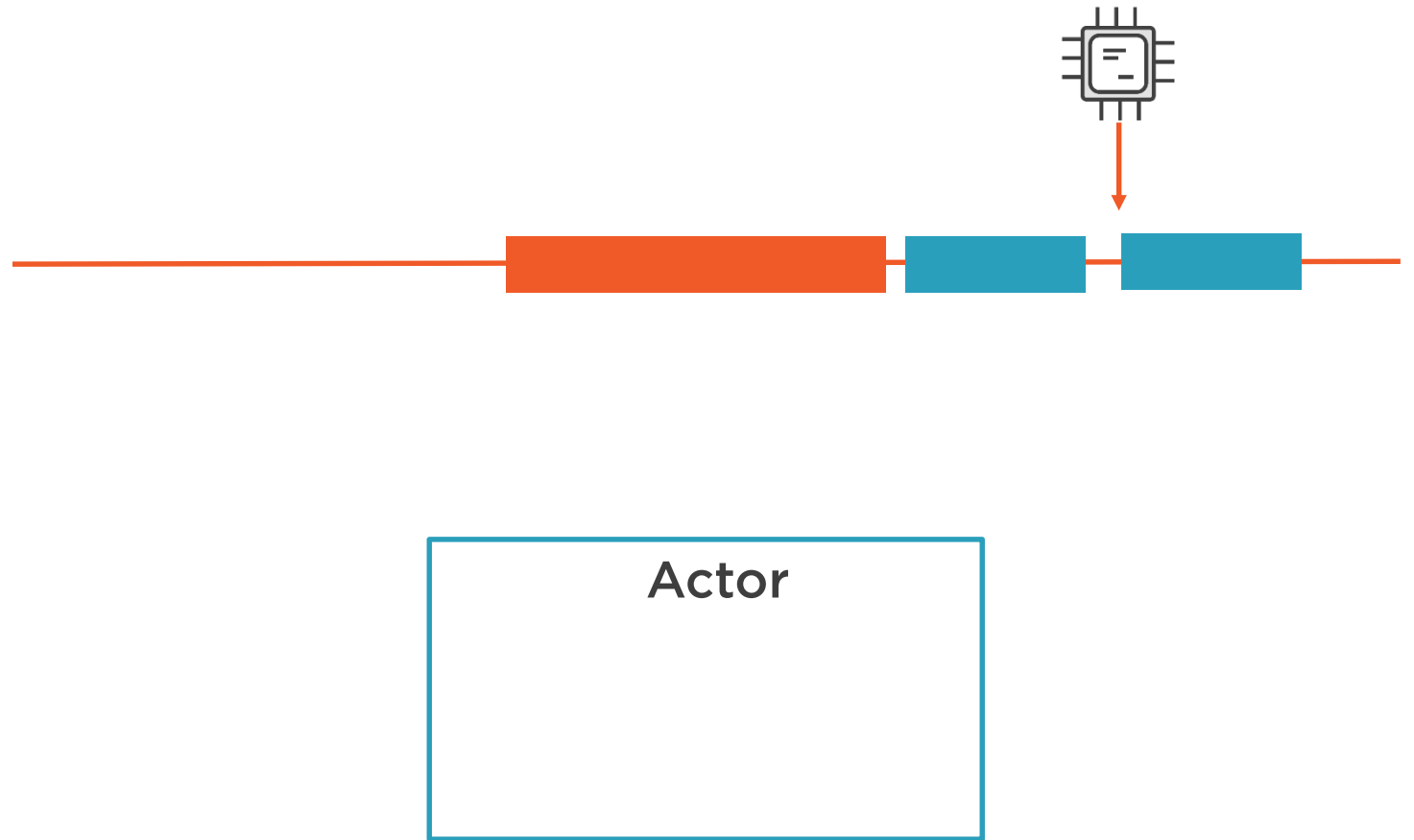
# Asynchronous Programming



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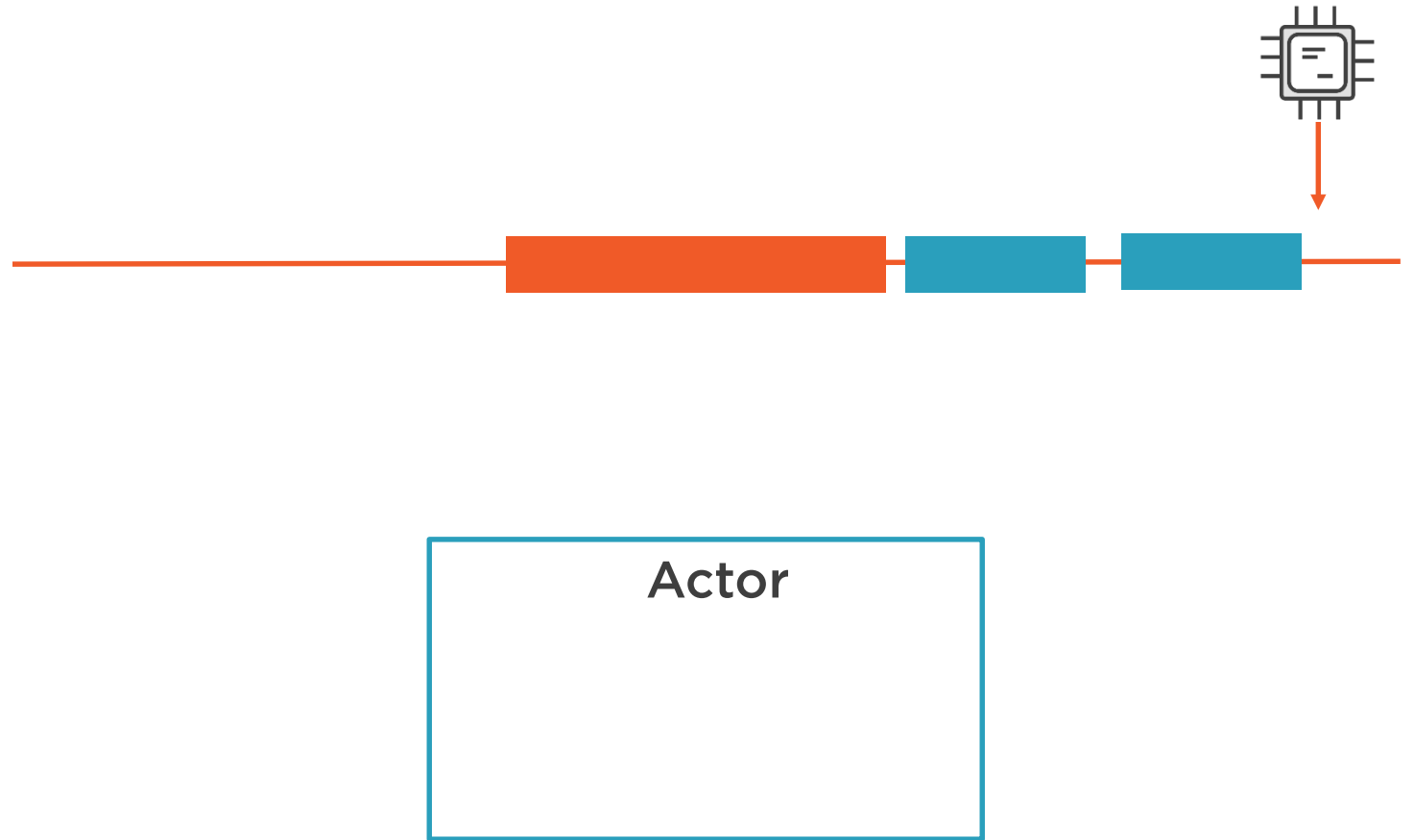


# Asynchronous Programming





# Asynchronous Programming



```
future = executor.submit(func, args*)  
... do other things ...  
result = future.result()
```



```
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```



```
future = executor.submit(func, args*)  
... do other things ...  
result = future.result()
```



```
future = executor.submit(func, args*)  
... do other things ...  
result = future.result() # can throw exception
```



# Future Methods

**cancel()** # attempt to cancel execution. Return True if successful



# Future Methods

**done()** # returns True if completed or canceled



# Future Methods

```
exception(timeout=None) # returns the exception raised, if any
```





# Future Methods

`add_done_callback(fn)` # attaches function to be called on completion or cancellation



# Module Functions

```
concurrent.futures.wait(fs, timeout=None, return_when=ALL_COMPLETED)
```



# Module Functions

```
concurrent.futures.wait(fs,  
                        timeout=None,  
                        return_when=ALL_COMPLETED)
```



# Module Functions

```
concurrent.futures.wait(fs,  
                        timeout=None,  
                        return_when=ALL_COMPLETED)
```



# Module Functions

```
concurrent.futures.as_completed(fs, timeout=None)
```



# Summary



**Abstracting Concurrency Mechanisms**

**The Executor API**

**The Future Object**

