# Scalable and distributed applications in Python



#### Hello!

#### I am Julien Danjou

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I hack, create and contribute to FOSS projects:









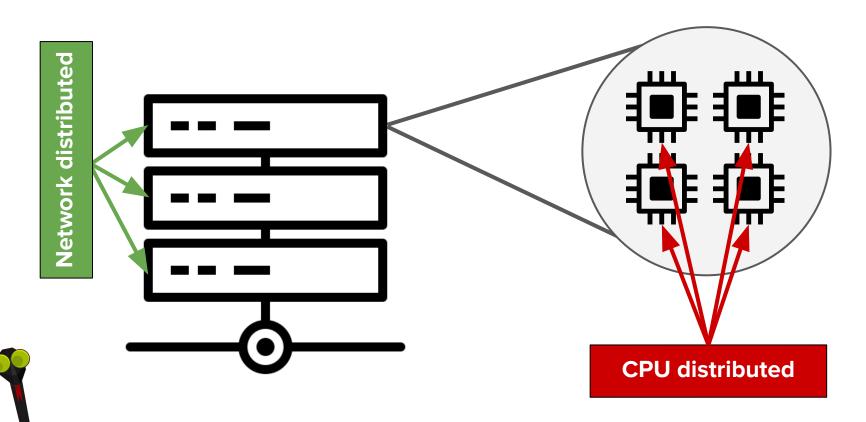






"the capability of a system, network, or process to handle a growing amount of work"





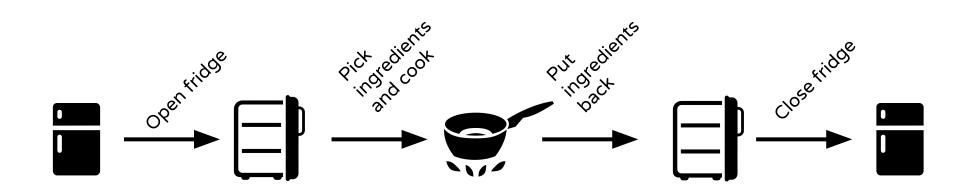
Distributed systems

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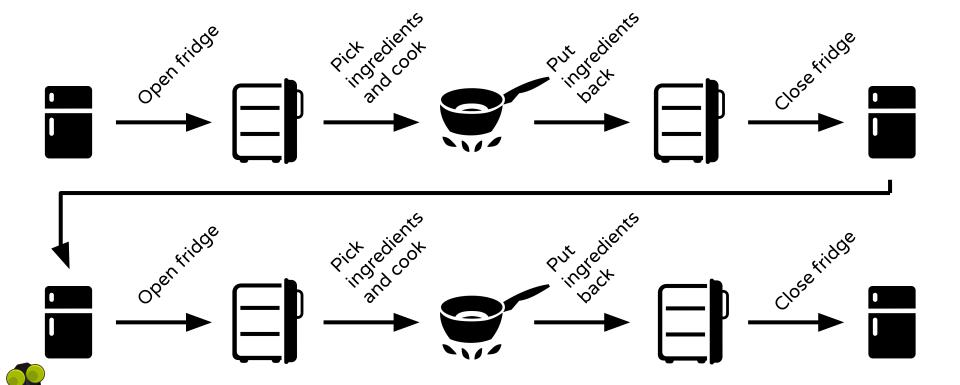
- Concurrency
- Parallelism
- Threading
- Processes
- Network distribution
- Queues
- Retrying
- Consistent hashring
- Caching

# 

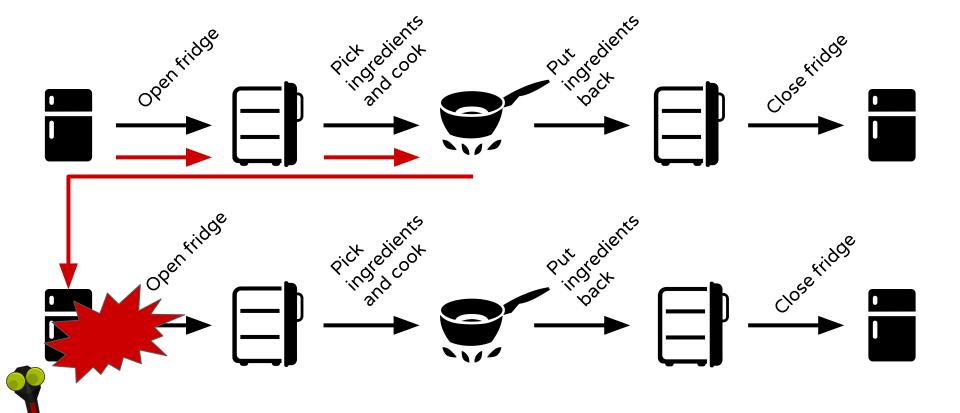




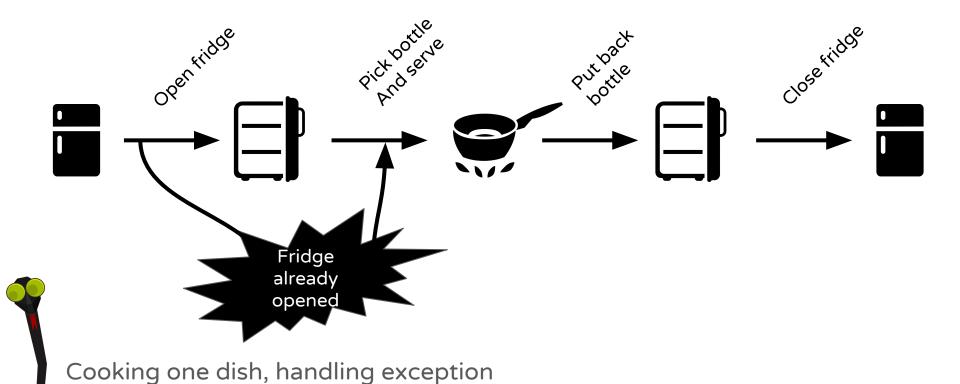


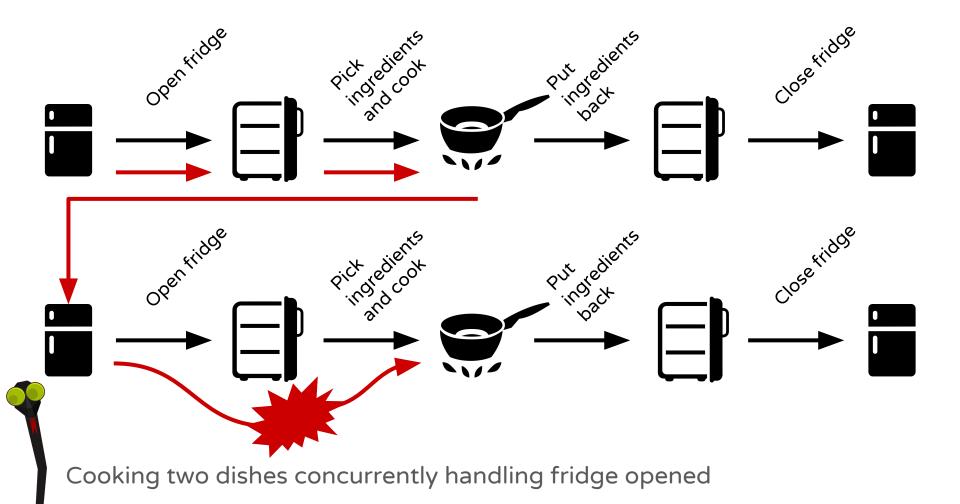


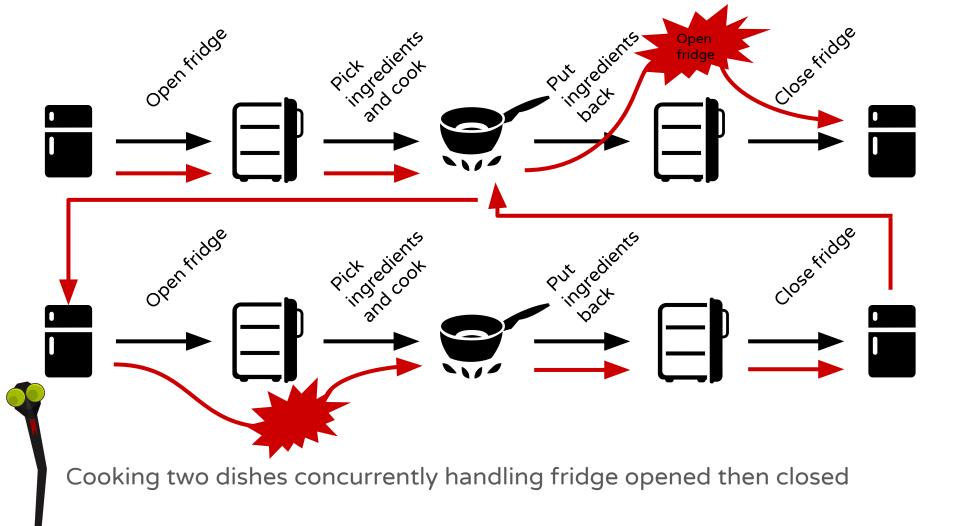
Cooking 2 dishes



Cooking 2 dishes concurrently











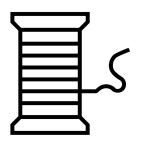
#### **Multi-threading**

How to

- Shared global state
- Modules
  - Threading
  - Concurrent.futures
    - threading + pool
  - Futurist
    - concurrent.futures with backlog control and statistics
- threading.Lock



## Use multi-threading for



 I/O intensive workload that can be parallelized and asynchronous

 Computing stuff without accessing Python data structures

 Running C extensions in parallel

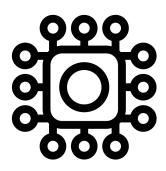


#### Multiprocessing

How to

- No shared global state
- 100% CPU**s** usage!
  - Independent GILs
- Modules
  - Multiprocessing
  - Concurrent.futures
    - Multiprocessing + pool
  - Cotyledon
    - Daemons
- Locks
  - multiprocessing.Lock
  - POSIX/SysV IPC
  - File-based locks (fasteners)
- No need for Go
  - o multiprocessing.Manager().Queue()

#### Use multiprocessing for



Daemons, long-running tasks

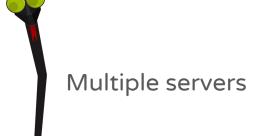
Stateless job processing

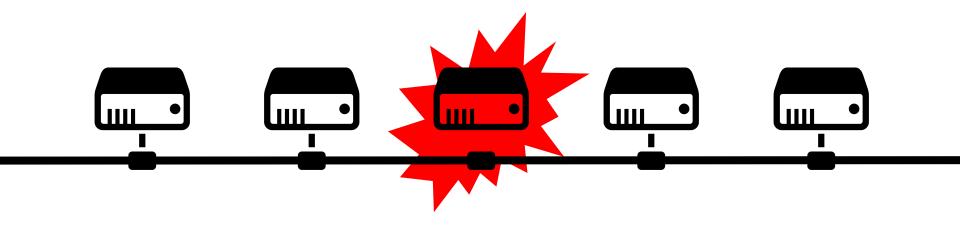
 First step toward a distributed system

#### **Distributed system**

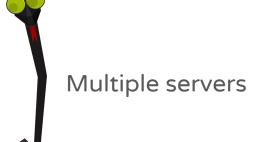


#### Distributed across network





#### What can fail will fail.



#### Pros

- No single-point-of-failure
- Horizontal scalability

#### Cons

- Failure of a node
  - Make failure a default scenario
- Failure of network
- Latency
  - Asynchronicity

## Use queues based systems



Easy to scale

Easy to implement

Easy to debug

... because they are functional (no-side effect)



rq

Based on Redis

• Low barrier of entry

Easy scalability

#### Celery



Multi-broker

Widely used

Language agnostic

Advanced features:

- Rate limits
- Routing

0

### Distributed locks

Not all are equals.

- ZooKeeper
- etcd
- Redis
- Consul
- memcached
- PostgreSQL
- MySQL

Tooz implements all of them, give it a try!

#### etcd

```
import etcd3
client = etcd3.client()
lock = client.lock("foobar")
with lock:
    print("do something")
```

#### Don't forget

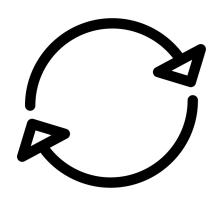
- Client disconnections, crashes, timeouts...
- Concurrency!
- Reliability
- Distributed lock manager crash (SPOF)
- Network latency
- Network outage

#### **Designing for failure**



```
while True:
    try:
         do something()
    except:
         pass
    else:
         break
```

#### **Need to handle:**



When to retry

How often to retry

What to do before retrying

What to do after retrying

#### tenacity

pip install tenacity

Define when to retry

Define how often to retry

 Define what to do before retrying

 Define what to do after retrying

#### Retry on exceptions and stop at some point



#### **Group membership**

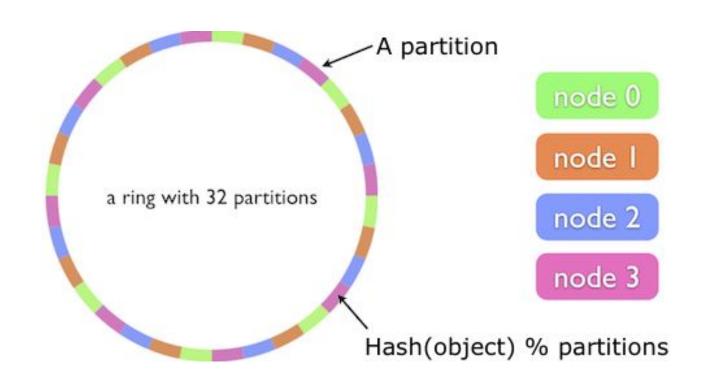
## Pick a coordinator

- ZooKeeper
- etcd
- Redis
- Consul
- memcached

Tooz implements all of them, give it a try!

#### **Use cases**

- Workload distribution
- Aliveness check
- Consistent hashring



Consistent hashring

#### Caching

Memoization or remote cache



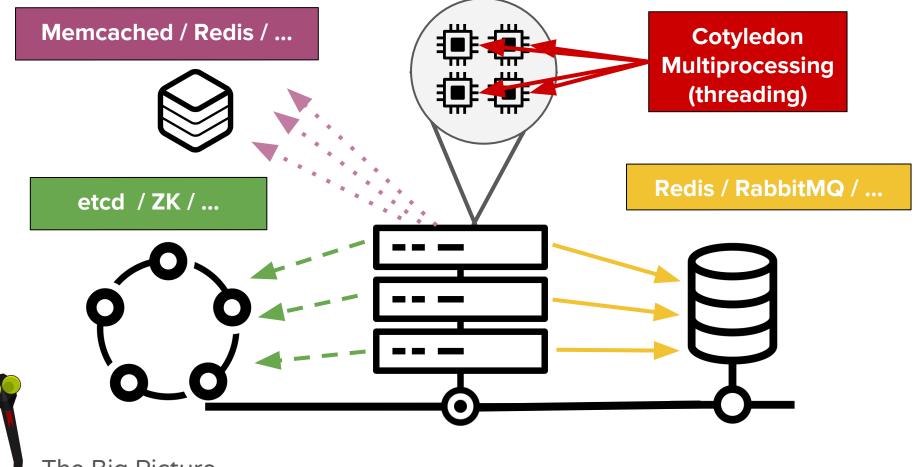
- High cost of computing data
- High latency of accessing data

- cachetools
- functools.lru\_cache
- dogpile.cache

Cache invalidation

#### cachetools

```
>>> import cachetools.func
>>> import math
>>> import time
>>> memoized sin = cachetools.func.ttl cache(ttl=5) (math.sin)
>>> memoized sin(3)
0.1411200080598672
>>> memoized sin.cache info()
CacheInfo(hits=0, misses=1, maxsize=128, currsize=1)
>>> memoized sin(3)
0.1411200080598672
>>> memoized sin.cache info()
CacheInfo(hits=1, misses=1, maxsize=128, currsize=0)
>>> time.sleep(5)
>>> memoized sin.cache info()
>>> CacheInfo(hits=1, misses=1, maxsize=128, currsize=0)
```



The Big Picture

#### **Questions, feedback:**

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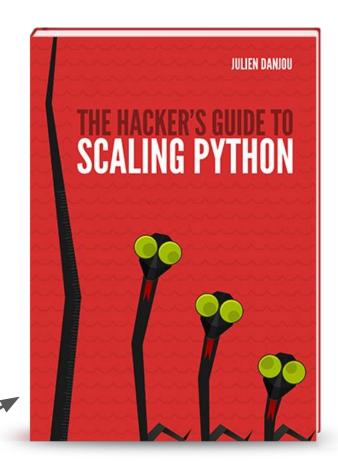
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Talk inspired by http://scaling-python.com/