

ThoughtWorks®

# Writing Robust and Maintainable Concurrent Program

*Wilson Tjhi*

*@wilsontjhi*

*Github: [wilsontjhi/pycon-asia-2018](https://github.com/wilsontjhi/pycon-asia-2018)*



What lessons can we learn from food seller about concurrency?

# Making of kue lapis sagu



# Making of kue lapis sagu

```
def build_layer(tray):
    start_mixer()
    pour_colour_mixture(colorama.Back.MAGENTA, tray)
    pour_colour_mixture(colorama.Back.GREEN, tray)
    pour_colour_mixture(colorama.Back.WHITE, tray)
```

# Making of kue lapis sagu

```
def build_layer(tray):
    start_mixer()
    pour_colour_mixture(colorama.Back.MAGENTA, tray)
    pour_colour_mixture(colorama.Back.GREEN, tray)
    pour_colour_mixture(colorama.Back.WHITE, tray)

def start_mixer():
    perform_operation(1.0)

def pour_colour_mixture(color, tray):
    perform_operation(0.005)
    tray.append(color + ' ')
```

# Making of kue lapis sagu

```
def main():
    tray = []
    for _ in range(4):
        build_layer(tray)
```

# Multithreading

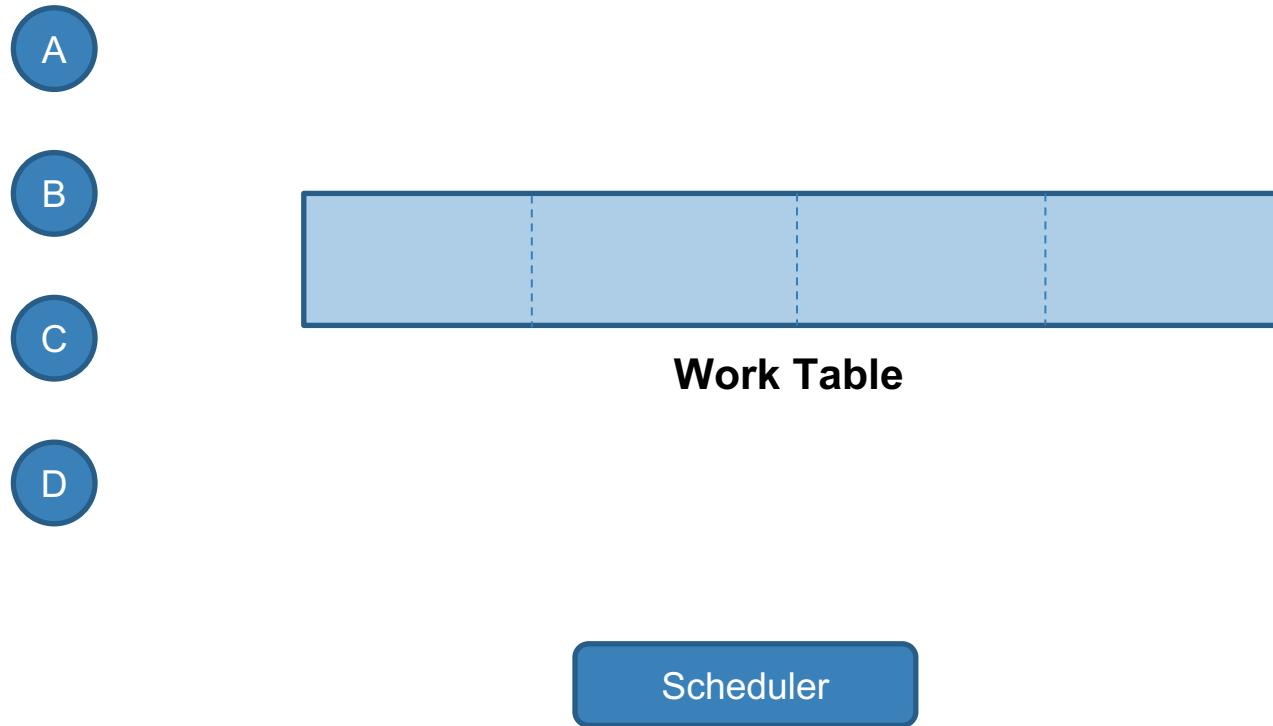
```
from threading import Thread

def main_thread():
    tray = []
    for _ in range(4):
        t = Thread(target=build_layer, args=(tray,))
        t.start()
```

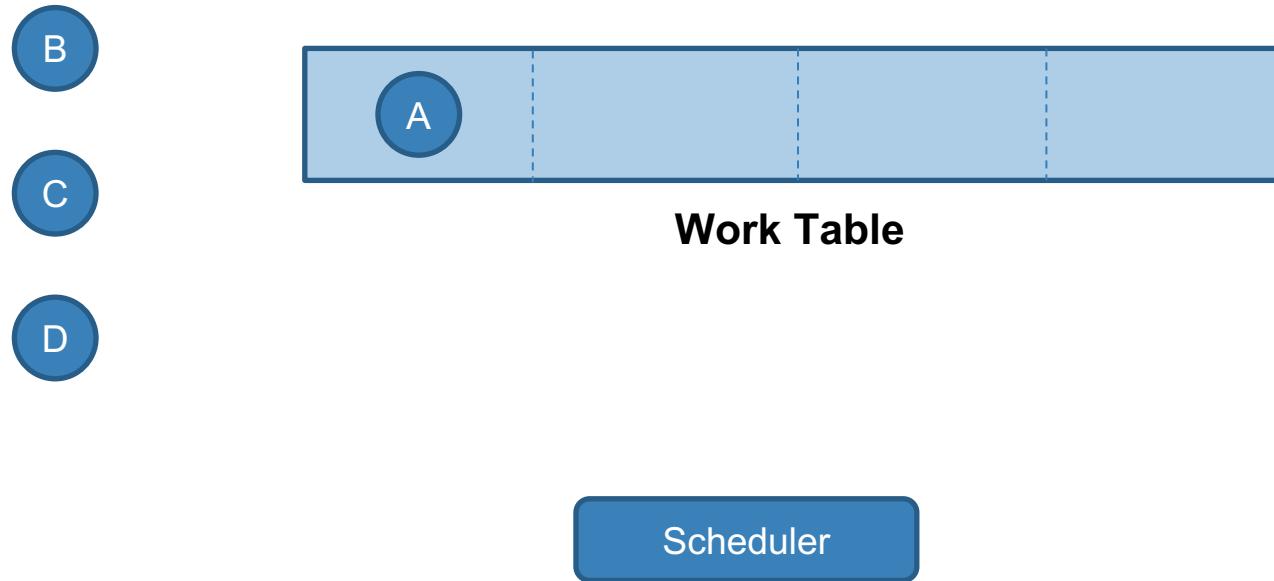
# Multithreading

- Python interpreter is not thread safe
- GIL (Global Interpreter Lock) ensures that only 1 thread can run at a time

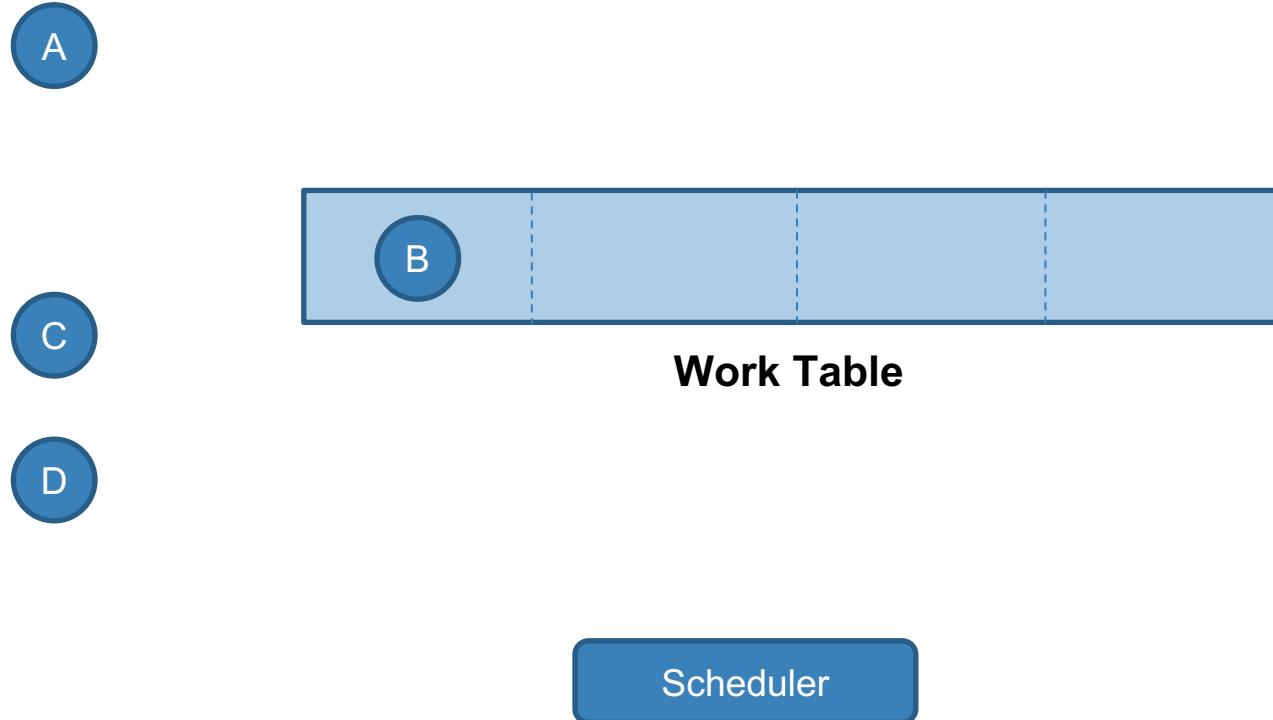
# Multithreading



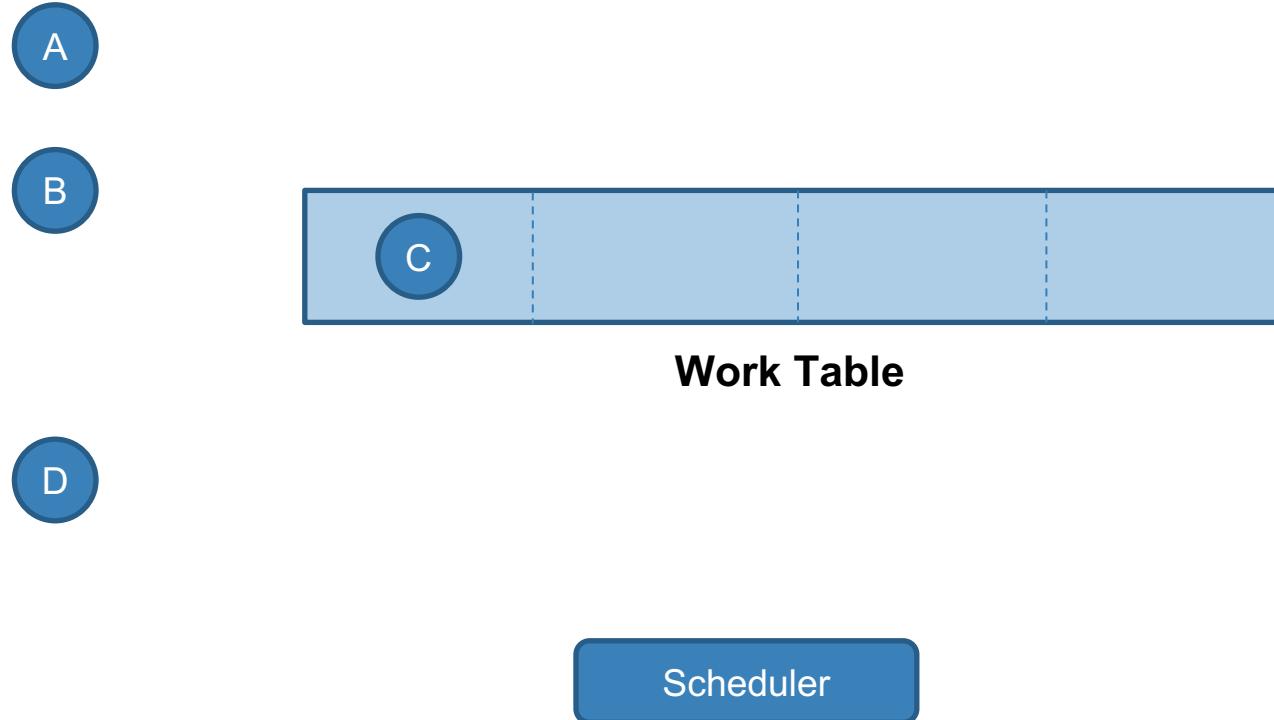
# Multithreading



# Multithreading



# Multithreading



*What is the purpose of threading  
then?*

# Multithreading

## I/O Operation vs Compute Operation

- Compute operation occurs in processor
- I/O operation occurs outside the processor

## Examples

- Disk operation
- Network operation
- Http call or web api
- Sleep

# Multithreading

```
def start_mixer():
    | perform_io_operation(1.0)
```

*Tip 1: Use multithreading for I/O operation*

*Watch out for synchronization problem due to  
preemption*

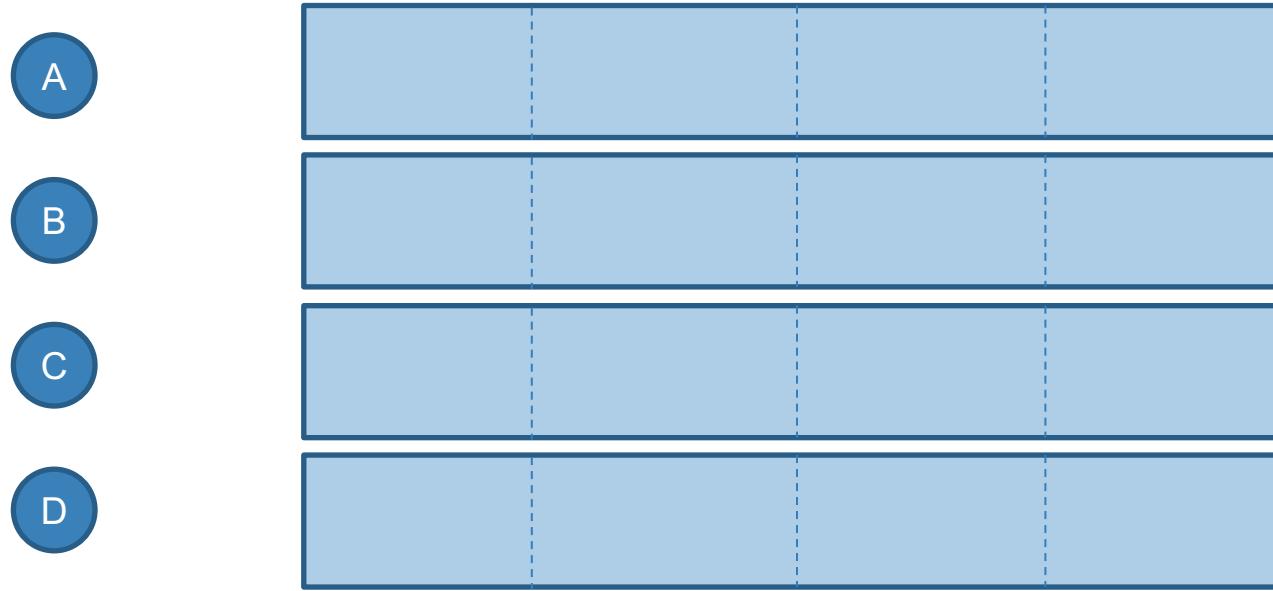
*What if I want to achieve  
parallelism?*

# Multiprocessing

```
from multiprocessing import Process, Queue

def main():
    tray = []
    result = Queue()
    for _ in range(4):
        p = Process(target=build_layer, args=(tray, result))
        p.start()
```

# Multiprocessing



*Tip 2: Use multiprocessing to achieve parallelism in compute operation*

*Watch out for the need for serialization*

# *The synchronization problem*

# Solution 1: Use lock?

```
lock = Lock()

def build_layer(tray):
    start_mixer()
    with lock:
        pour_colour_mixture(colorama.Back.MAGENTA, tray)
        pour_colour_mixture(colorama.Back.GREEN, tray)
        pour_colour_mixture(colorama.Back.WHITE, tray)
```

# Solution 2: Always design for concurrency

**The Pragmatic Programmer by Andrew Hunt and David Thomas**



- **To Prevent:** Programming by coincidence

# No shared state & No side effect

```
def main_thread():
    tray = []
    for _ in range(4):
        t = Thread(target=build_layer, args=(tray,))
        t.start()
```

# No shared state



# No shared state

```
def main_thread():
    result = []
    threads = []
    for _ in range(4):
        tray = []
        t = Thread(target=build_layer, args=(tray,))
        t.start()
        threads.append(t)
        result.append(tray)
    for t in threads:
        t.join()

final_tray = reduce(lambda acc, tray: acc + tray, result, [])
```

# No shared state

```
from concurrent.futures import ThreadPoolExecutor

def main_pool():
    with ThreadPoolExecutor() as pool:
        result = pool.map(build_layer, range(4))
    final_tray = reduce(lambda acc, tray: acc + tray, result, [])
```

# Idempotent state

The meaning of the state does not change, even when updates to the state do not happen in the same sequence.



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# Idempotent state



Further discussion: Final chapter of  
“Seven Concurrency Models in Seven Weeks” by Paul Butcher

## *Design for concurrency*

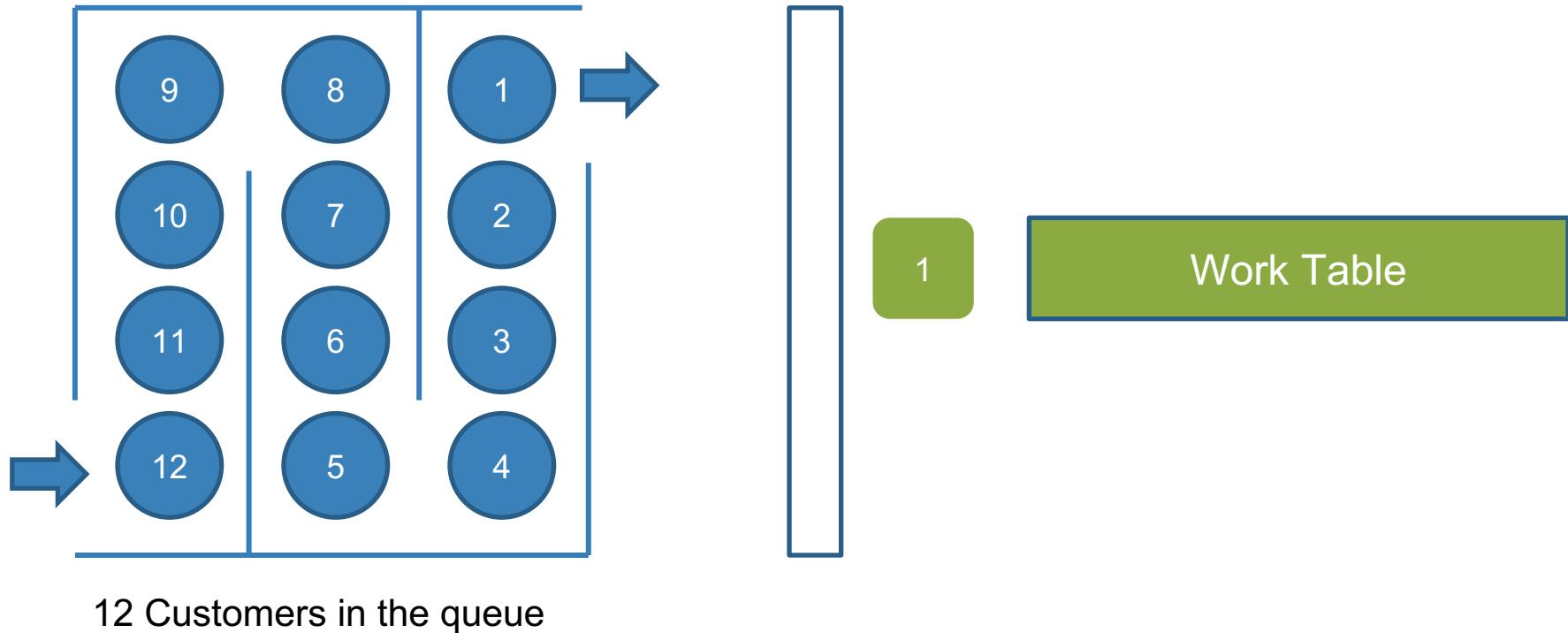
*Tip 3: No shared state & no side effect*

*Tip 4: Use pool.map from concurrent.futures*

*Tip 5: Have an idempotent state*

*Once we have designed code for concurrency,  
we can apply different concurrent model easily.*

# Restaurant queue

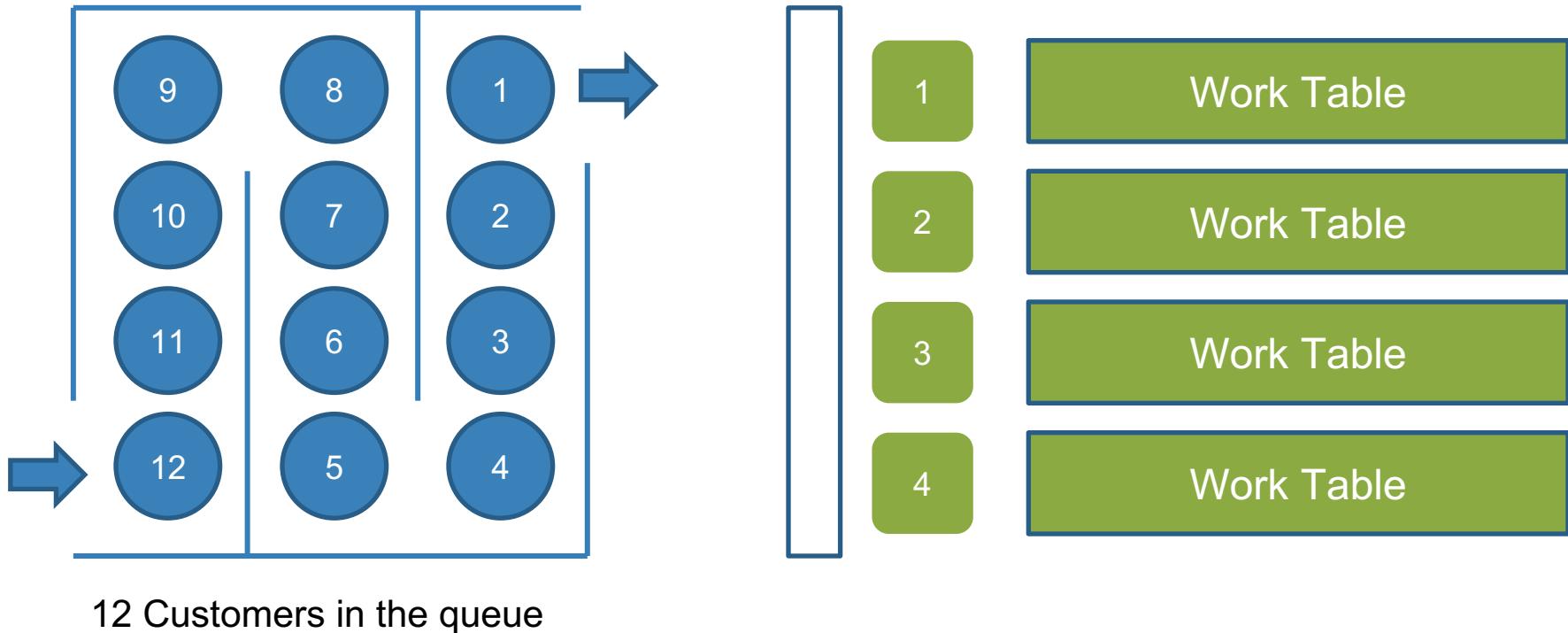


# Restaurant queue

```
def prepare_order(_):  
    take_order(_)  
    prepare_sandwich()  
    prepare_kue_lapis()  
    prepare_ice_cream()  
    prepare_milk_shake()
```

*Try embarrassingly parallel*

# Embarrassingly Parallel



# Embarrassingly Parallel

```
def main_multi_process(num_of_customer):
    with ProcessPoolExecutor(4) as pool:
        pool.map(prepare_order, range(num_of_customer))
```

*Look for I/O operations,  
and implement fan-out fan-in model*

# Fan-out fan-in



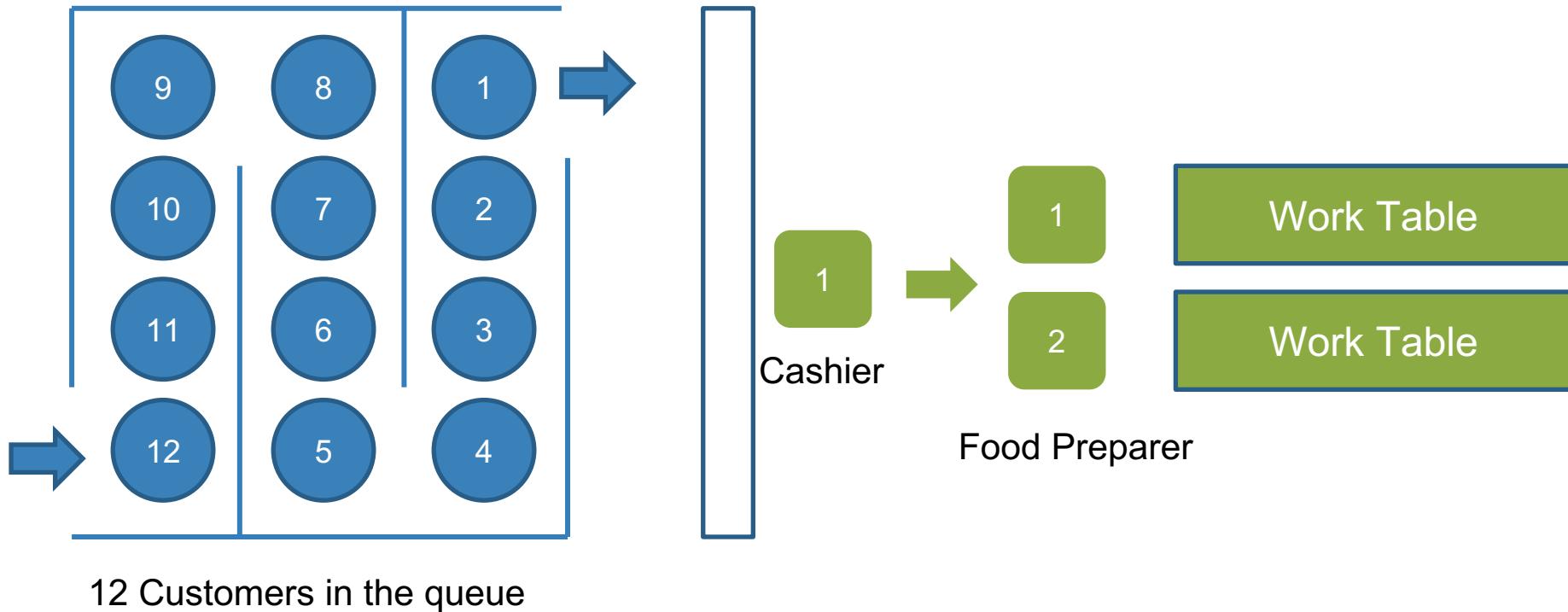
Pycon 2014 by Brett Slatkin on fan-out and fan-in: <https://youtu.be/CWmq-jtkemY>

# Fan-out fan-in (using asyncio)

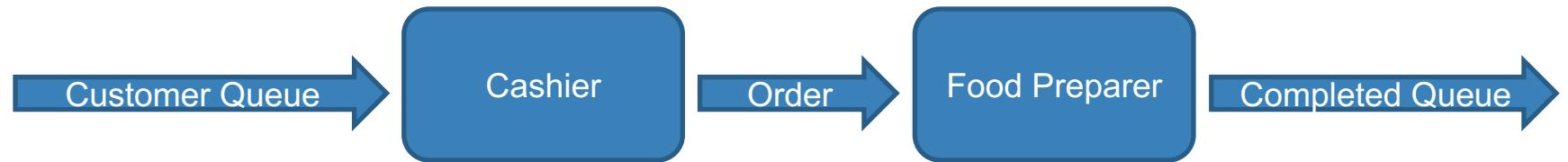
```
async def prepare_food():
    awaiting_kue_lapis = prepare_kue_lapis()
    awaiting_milk_shake = prepare_milk_shake()
    prepare_sandwich()
    prepare_ice_cream()
    await asyncio.wait([awaiting_kue_lapis, awaiting_milk_shake])
```

*Try pipelining*

# Producer Consumer Queue



# Producer Consumer Queue



# Producer Consumer Queue

```
def main(num_of_user):
    customer_queue = multiprocessing.JoinableQueue()
    order_queue = multiprocessing.JoinableQueue()
    completed_queue = multiprocessing.Queue()

    cashier = Actor(customer_queue, order_queue, take_order)
    preparer1 = Actor(order_queue, completed_queue, prepare_order)
    preparer2 = Actor(order_queue, completed_queue, prepare_order)

    cashier.start()
    preparer1.start()
    preparer2.start()

    for user_no in range(num_of_user):
        customer_queue.put(user_no + 1)
```

# Summary

- Always design for concurrency
- Understand the basic building block of concurrency in Python
- Make use of the appropriate concurrency model.

# THANK YOU

*For questions or suggestions:*

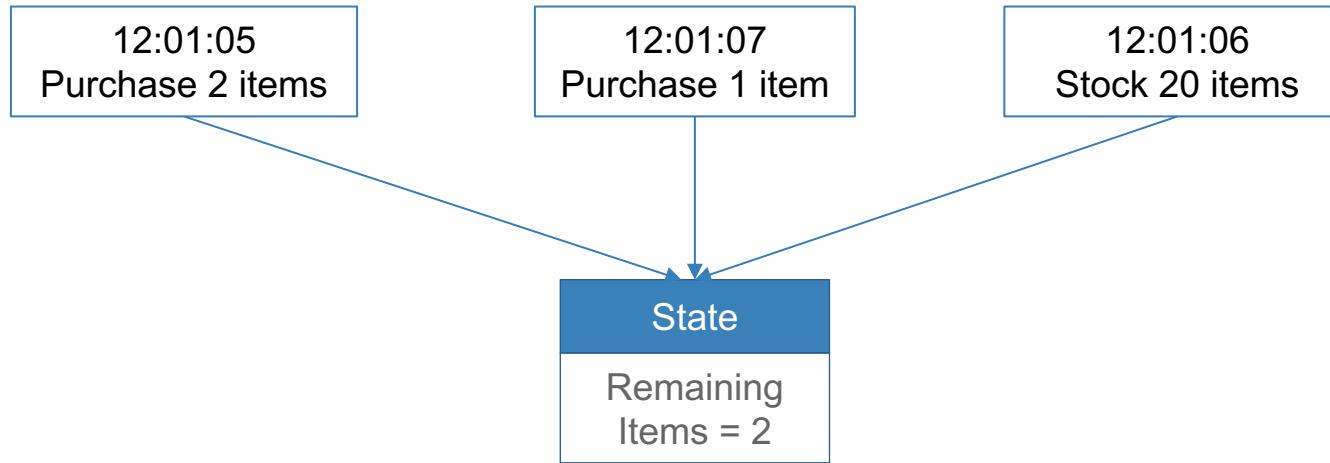
*Wilson Tjhi (@wilsontjhi)  
[wtjhi@thoughtworks.com](mailto:wtjhi@thoughtworks.com)*

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# Idempotent state

Inventory management system



# Idempotent state

Store transaction events which can be played back to calculate the total remaining item.

Idempotent State
12:01:05 Purchase 2 items
12:01:07 Purchase 1 item
12:01:06 Stock 20 items