The Scheduler Saga

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kavya

the innards of the scheduler

the scheduler

the behind-the-scenes orchestrator of Go programs.

```
func main() {
  // Create goroutines.
  for _, i := range images {
     go process(i)
  }
  // Wait.
  <-ch
}</pre>
```

```
func main() {
  // Create goroutines.
  for _, i := range images {
      go process(i)
                           runs goroutines created
  // Wait.
                                pauses and resumes them:
  <-ch
                                blocking channel operations,
                                mutex operations.
func process(image) {
 // Create goroutine.
  go reportMetrics()
  complicatedAlgorithm(image)
                                coordinates:
 // Write to file.
                           → blocking system calls, network I/O,
  f, err := os.OpenFile()
                                runtime tasks garbage collection.
```

```
func main() {
  // Create goroutines.
  for _, i := range images {
      go process(i)
                           --- runs goroutines created
  // Wait.
                                 pauses and resumes them:
  <-ch
                                 blocking channel operations,
                                 mutex operations.
func process(image) {
 // Create goroutine.
 go reportMetrics()
 complicatedAlgorithm(image)
                                coordinates:
 // Write to file.
                           blocking system calls, network I/O,
 f, err := os.OpenFile()
                                runtime tasks garbage collection.
```

...for hundreds of thousands of goroutines*

^{*} dependent on workload and hardware, of course.

the **design** of the scheduler, & its scheduling **decisions** impact the **performance** of our programs.

spec it

the important questions.

build!

the big ideas & one sneaky idea.

assess it.

the difficult questions.

spec it

the what, when & why.

goroutines are user-space threads.



• conceptually similar to kernel threads managed by the OS, but managed entirely by the Go runtime.

goroutines are user-space threads.



- o conceptually similar to kernel threads managed by the OS, but managed entirely by the Go runtime.
- O lighter-weight and cheaper than kernel threads.

smaller memory footprint:

initial goroutine stack = 2KB; default thread stack = 8KB. state tracking overhead.

faster creation, destruction, context switches:

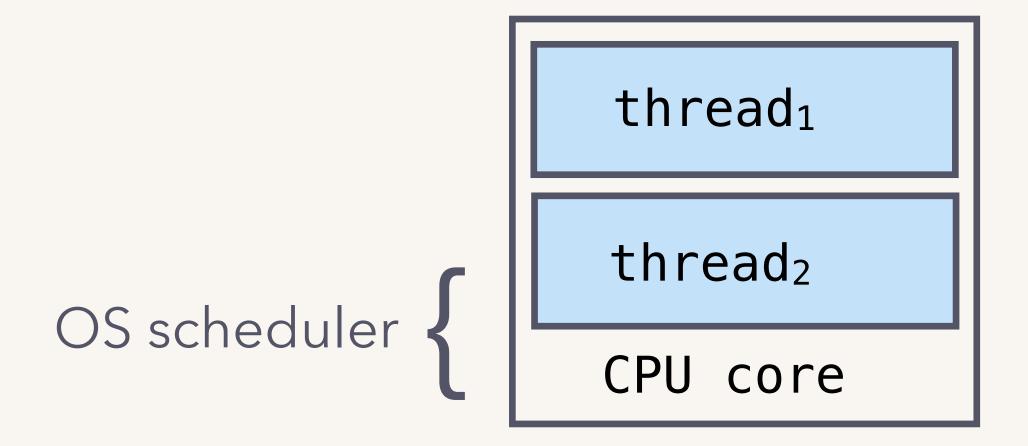
goroutine switches = \sim tens of ns; thread switches = \sim a μ s.

goroutines are user-space threads.



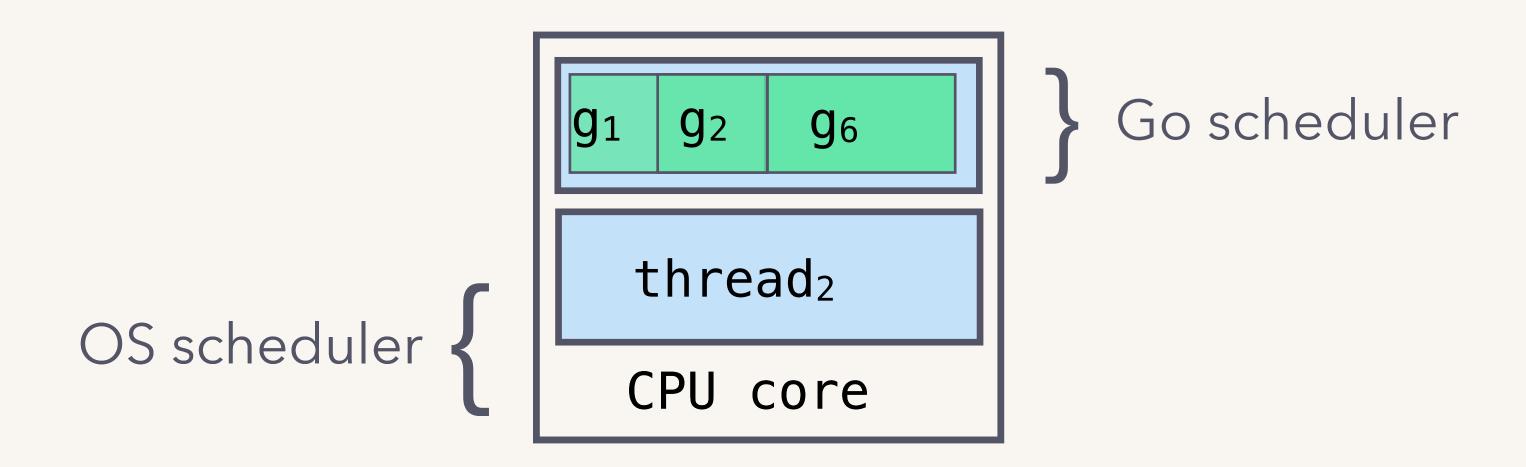
O lighter-weight and cheaper than kernel threads.

...but how are they run?



goroutines are user-space threads.

- O conceptually similar to kernel threads managed by the OS, but managed entirely by the Go runtime.
- O lighter-weight and cheaper than kernel threads.
- o multiplexed onto kernel threads.



when does it schedule?

when does it schedule?

At operations that should or would affect goroutine execution.

```
func main() {
  // Create goroutines.
  for _, i := range images {
                                     goroutine creation
      go process(i)
                                     run new goroutines soon,
                                     continue this for now.
  // Wait.
  <-ch
                                goroutine blocking
                                     pause this one immediately.
func process(image) {
 // Create goroutine.
 go reportMetrics()
 complicatedAlgorithm(image)
 // Write to file.
 f, err := os.OpenFile()
                                      blocking system call
  . . .
                                      the <u>thread itself blocks</u> too!
```

when does it schedule?

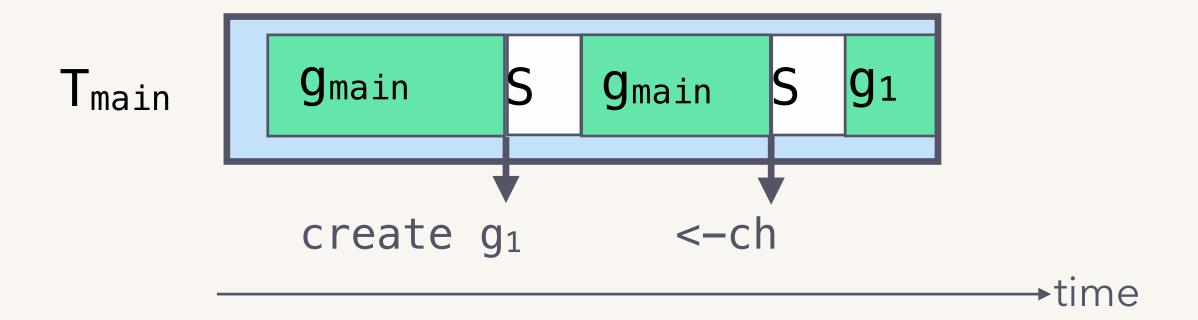
At operations that should or would affect goroutine execution.

The runtime causes a switch into the scheduler under-the-hood, and the scheduler may schedule a <u>different goroutine</u> on <u>this thread</u>.

T: threads

g: goroutines

S: scheduler



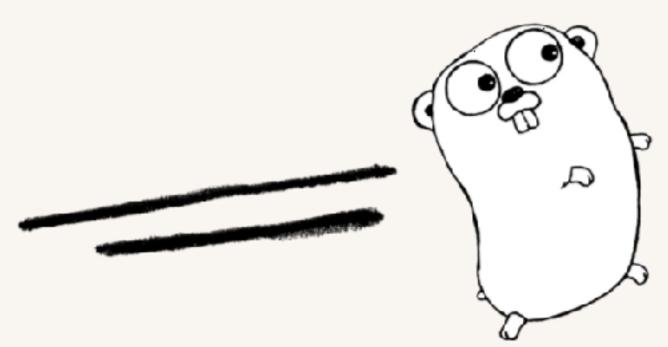
#schedgoals

for scheduling goroutines onto kernel threads.

- use a small number of kernel threads. kernel threads are expensive to create.
- usupport high concurrency.

 Go programs should be able to run lots and lots of goroutines.
- □ leverage parallelism i.e. scale to N cores.

On an N-core machine, Go programs should be able to run N goroutines in parallel.*



^{*} depending on the program structure, of course.

build it!

the big ideas & neat details.

how to multiplex goroutines onto kernel threads?

when to create threads?

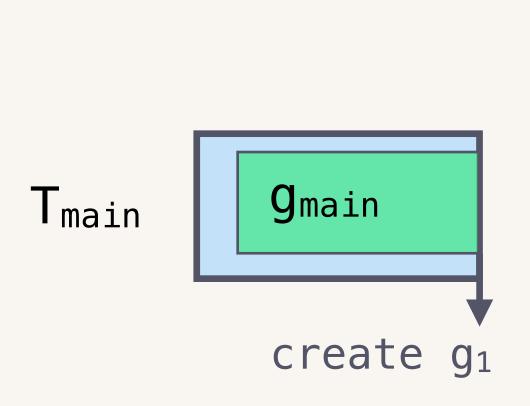
how to distribute goroutines across threads?

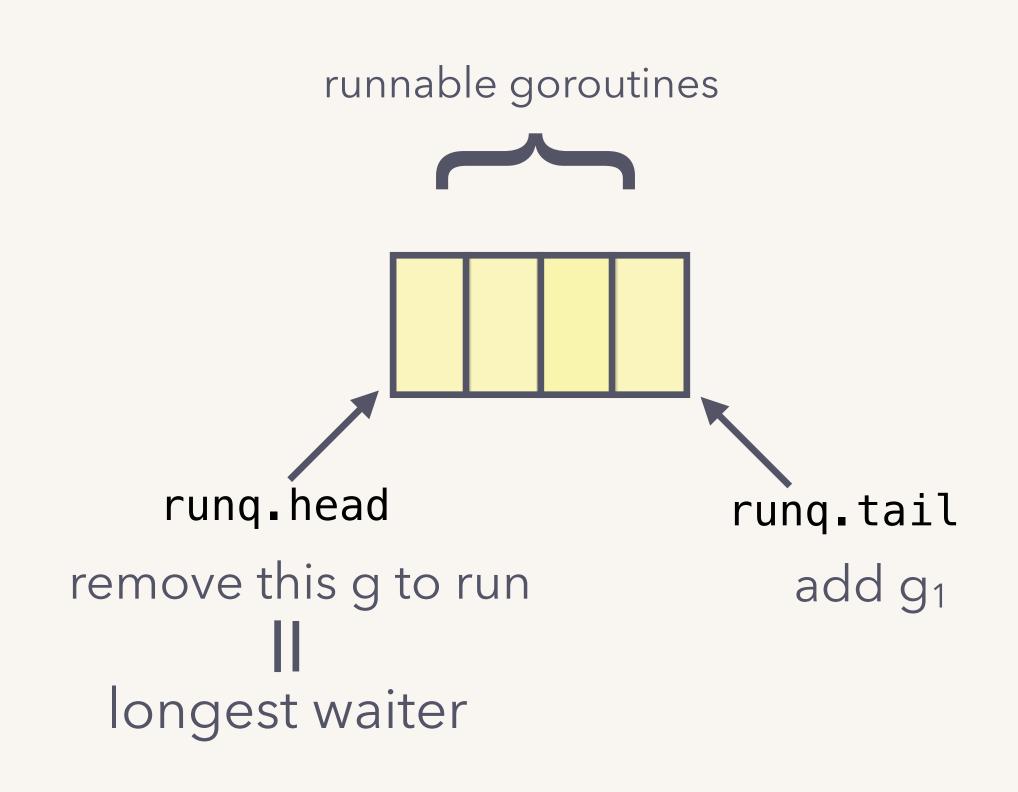
prelude: runqueues

Goroutines that ready-to-run and need to be scheduled are tracked in heap-allocated FIFO <u>runqueues</u>.

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Goroutines that ready-to-run and need to be scheduled are tracked in heap-allocated FIFO <u>runqueues</u>.





program heap memory

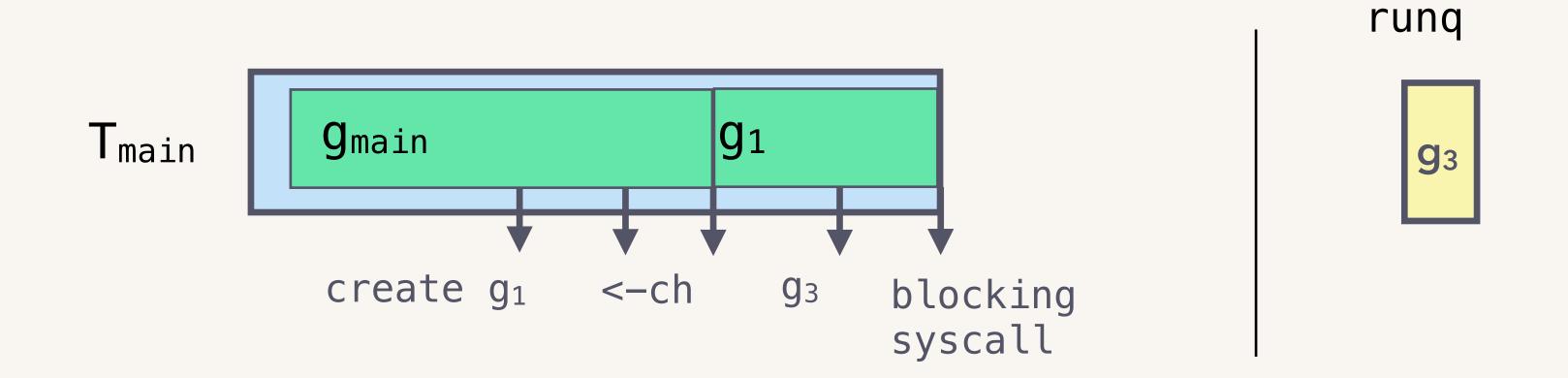
```
Gmain
              func main() {
                // Create goroutines.
                for _, i := range images {
                     go process(i)
                                                        creates g<sub>1</sub>,
                                                                   g<sub>2</sub>
                // Wait.
                                                        goroutine blocks
                <-ch
             func process(image) {
 g<sub>1</sub>
                   . . .
```

assume: running on a box with 2 CPU cores.

first, the non-ideas

first, the non-ideas

I. Multiplex all goroutines on a single thread.



– no concurrency!

if a goroutine blocks the thread, no other goroutines run either.

- no parallelism possible:

can only use a single CPU core, even if more are available.

first, the non-ideas

- II. Create & destroy a thread per-goroutine.
 - defeats the purpose of using goroutines
 threads are heavyweight, and expensive to create and destroy.

okay, here's an idea...

idea I: reuse threads

Create threads when needed

there're goroutines to run, but all threads are busy.

idea I: reuse threads

Create threads when needed; keep them around for reuse.

there're goroutines to run, but all threads are busy.

"thread parking" i.e.

put them to sleep;

no longer uses a CPU core.

track idle threads in a list.

idea I: reuse threads

Create threads when needed; keep them around for reuse.

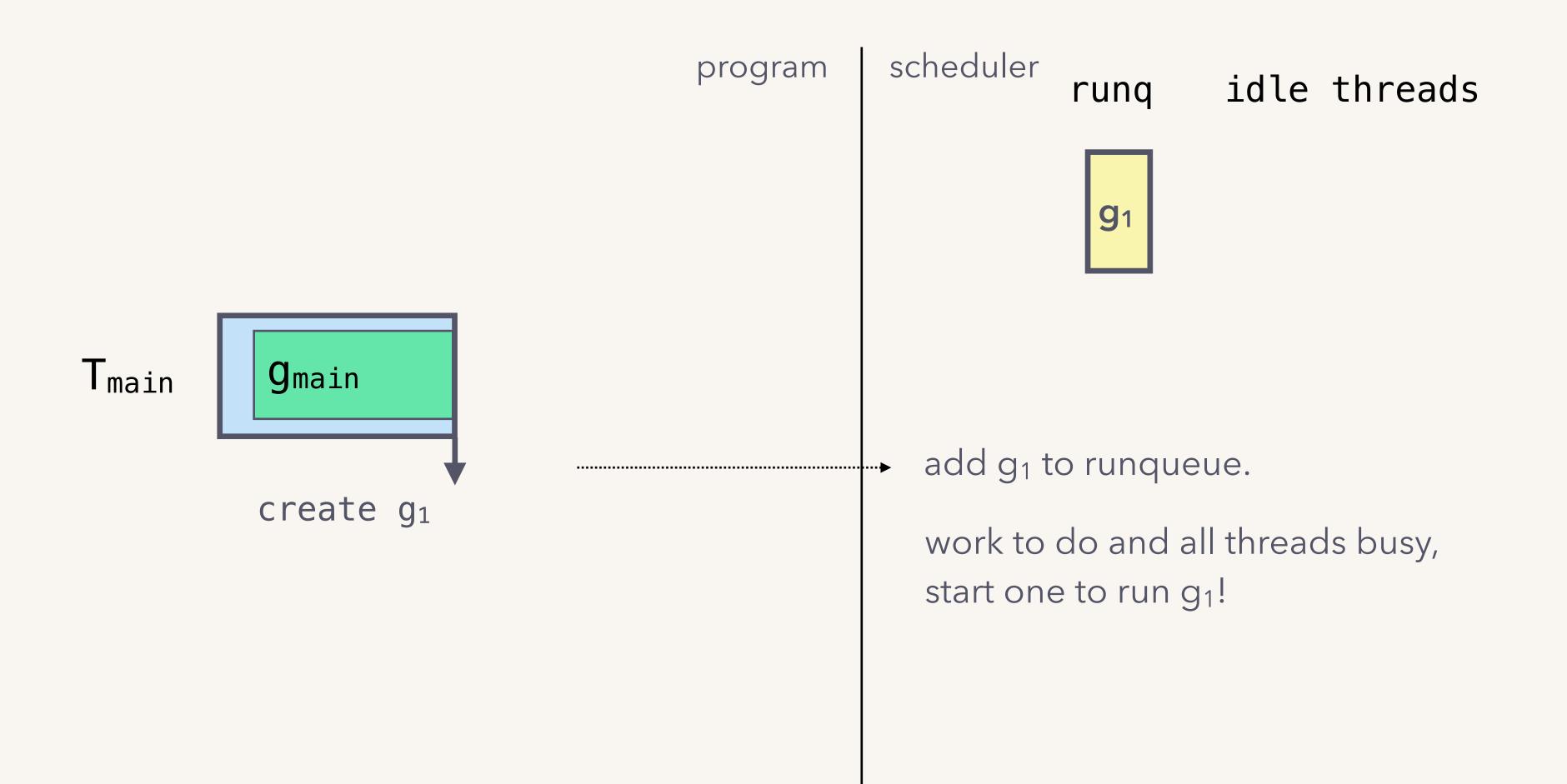
The threads get goroutines to run from a runqueue.

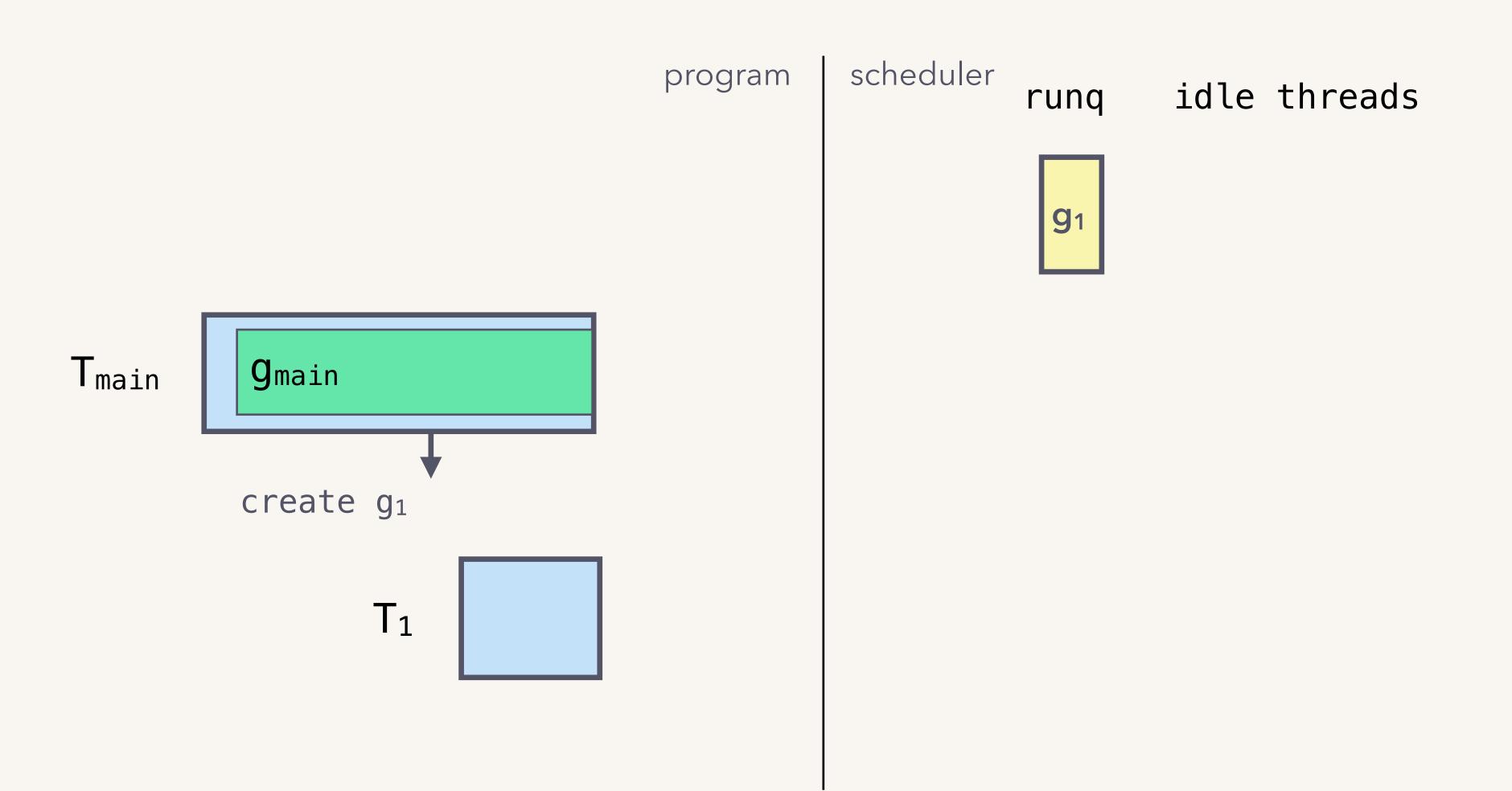
program scheduler runq idle threads

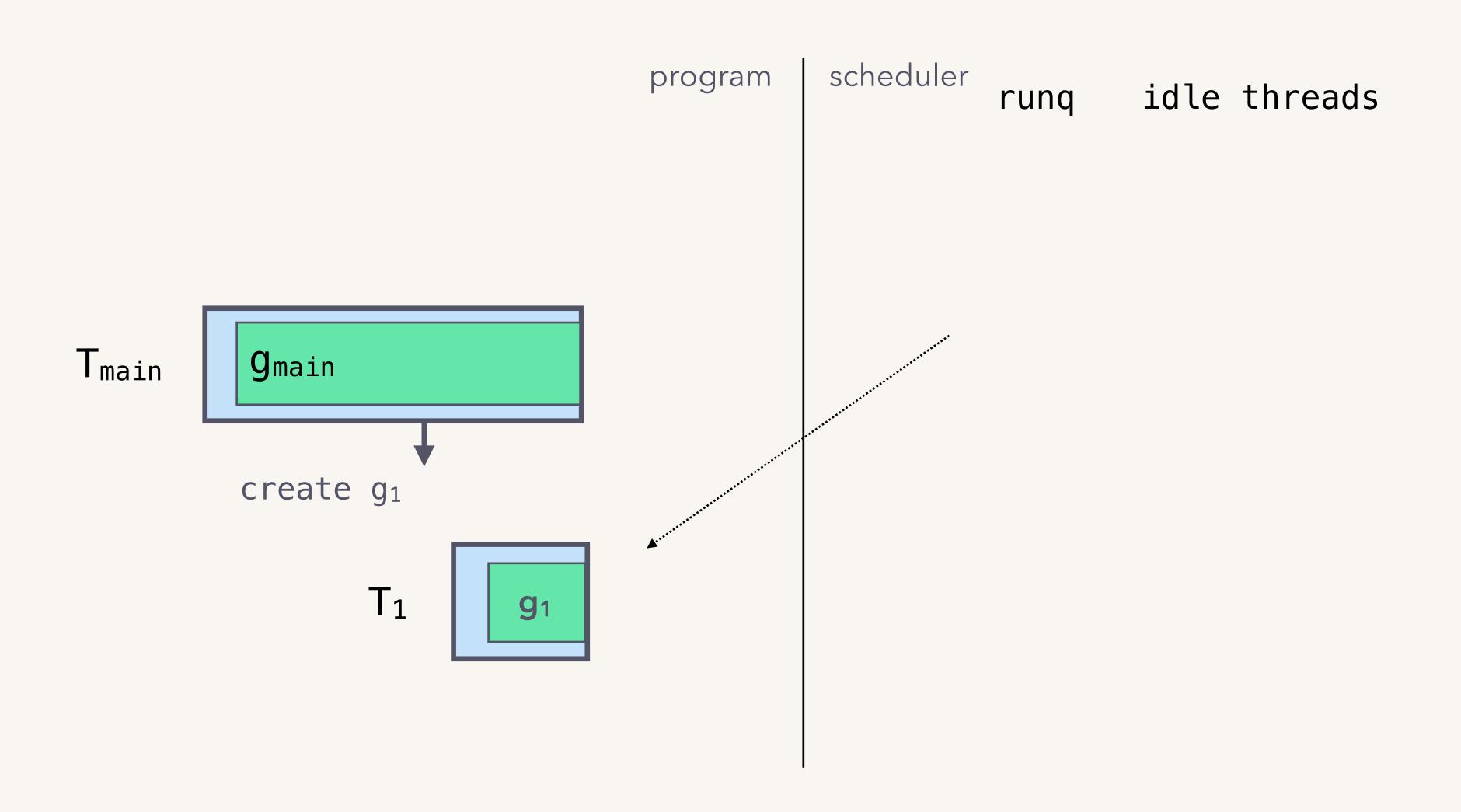
 $\mathsf{T}_{\mathsf{main}}$

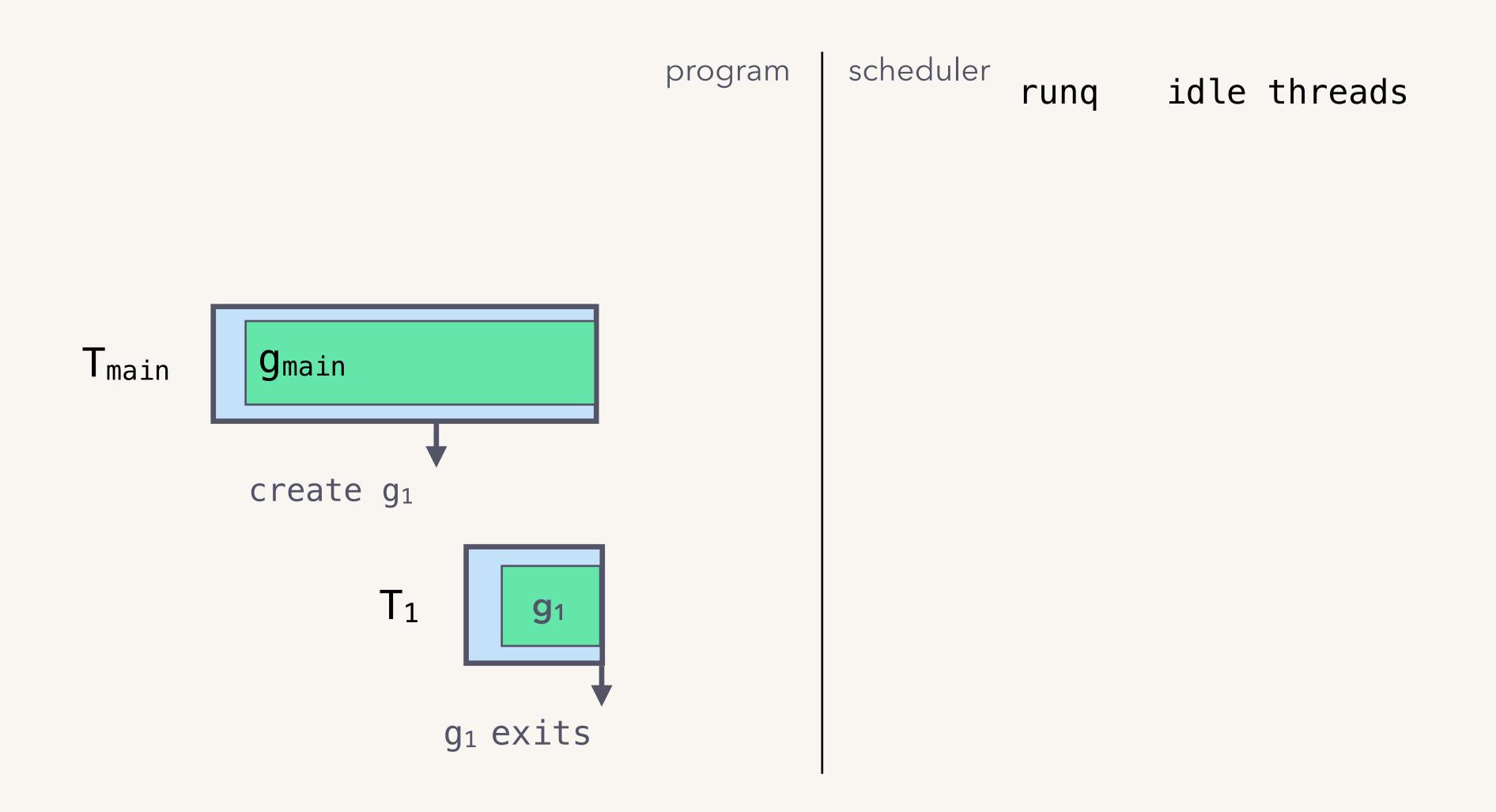
Gmain

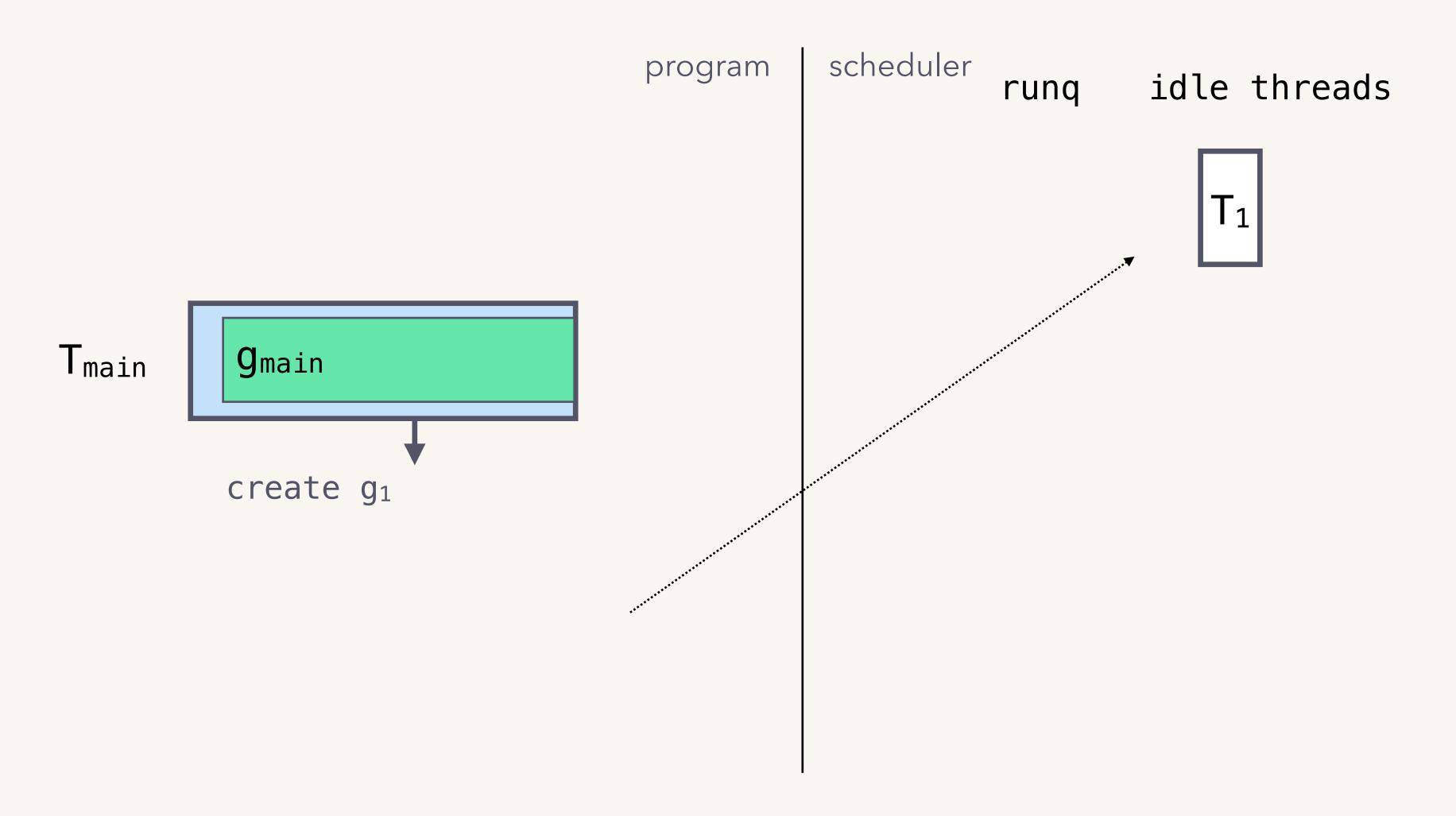
scheduler program idle threads runq T_{main} **G**main create g₁



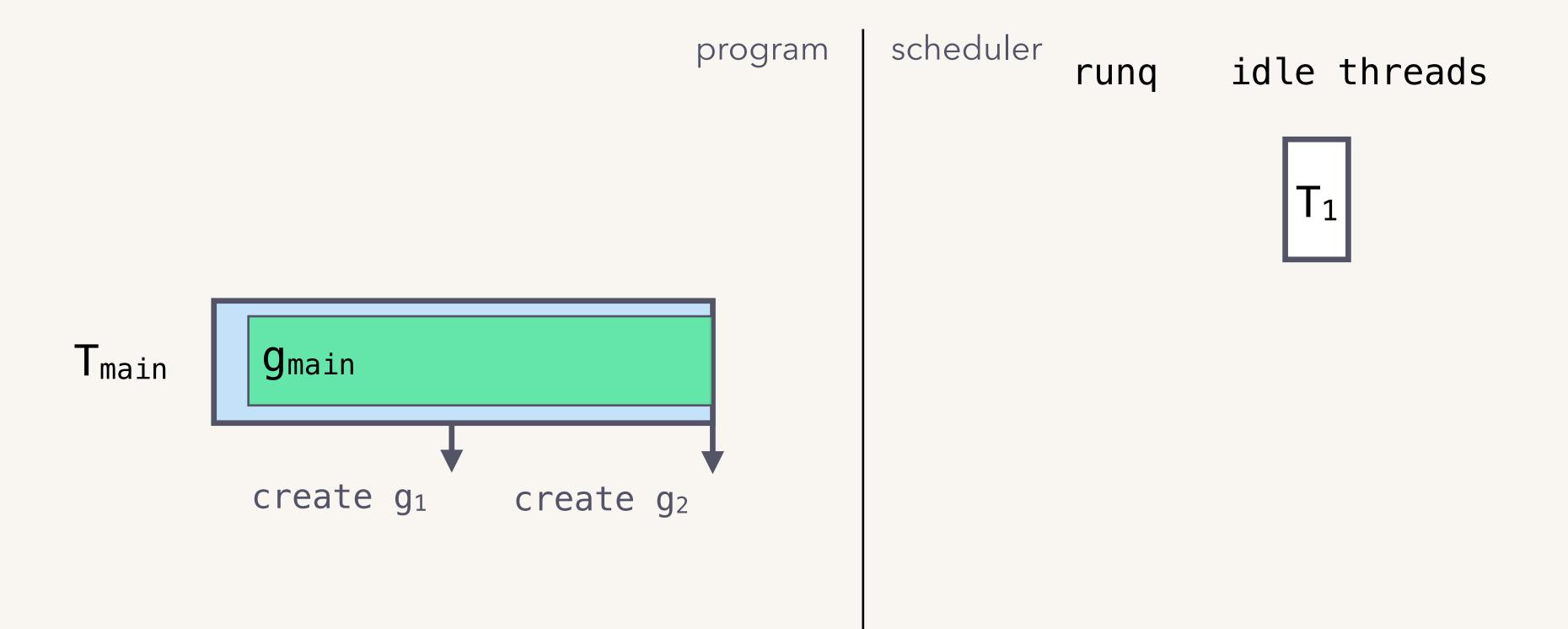


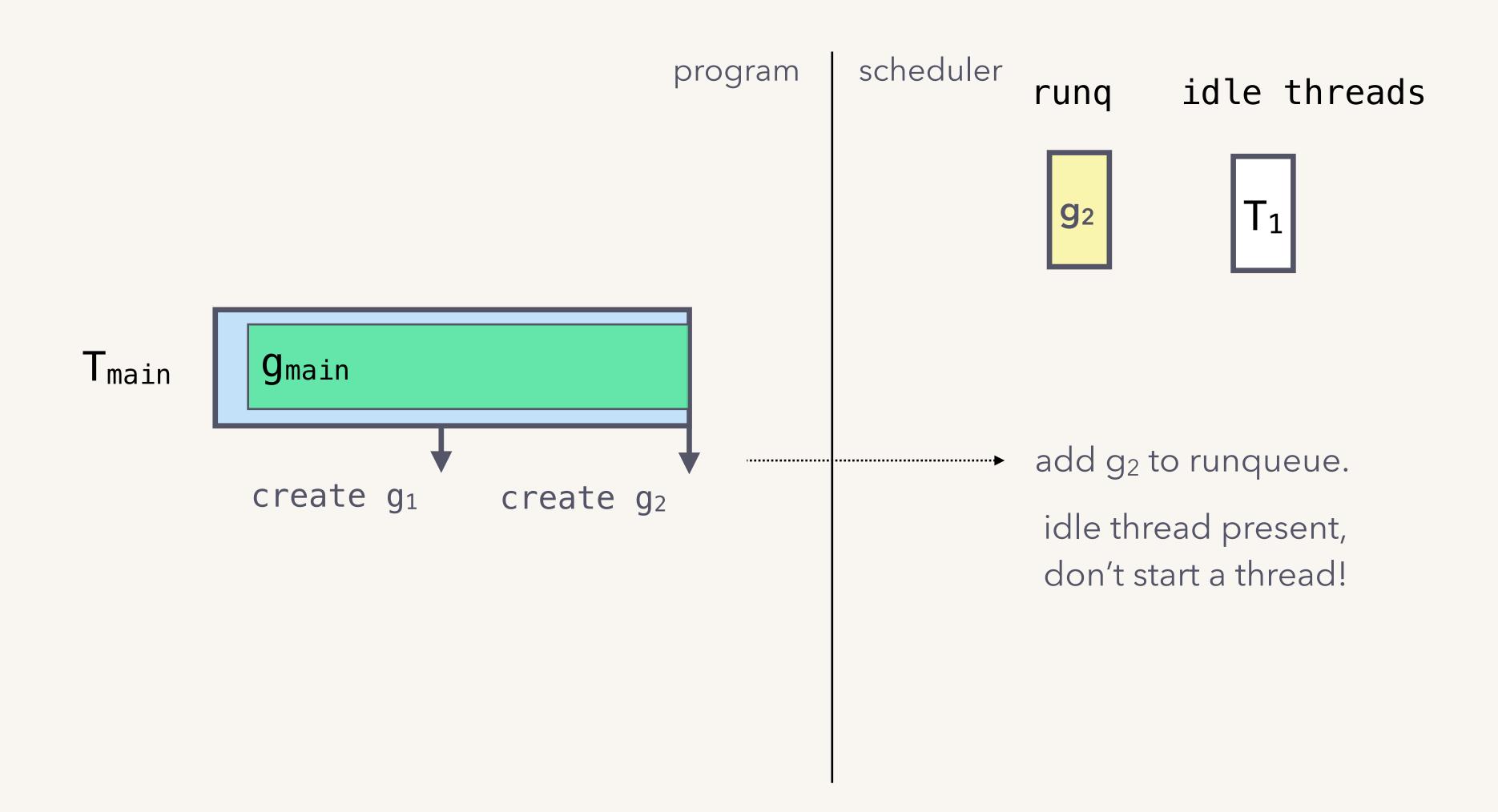


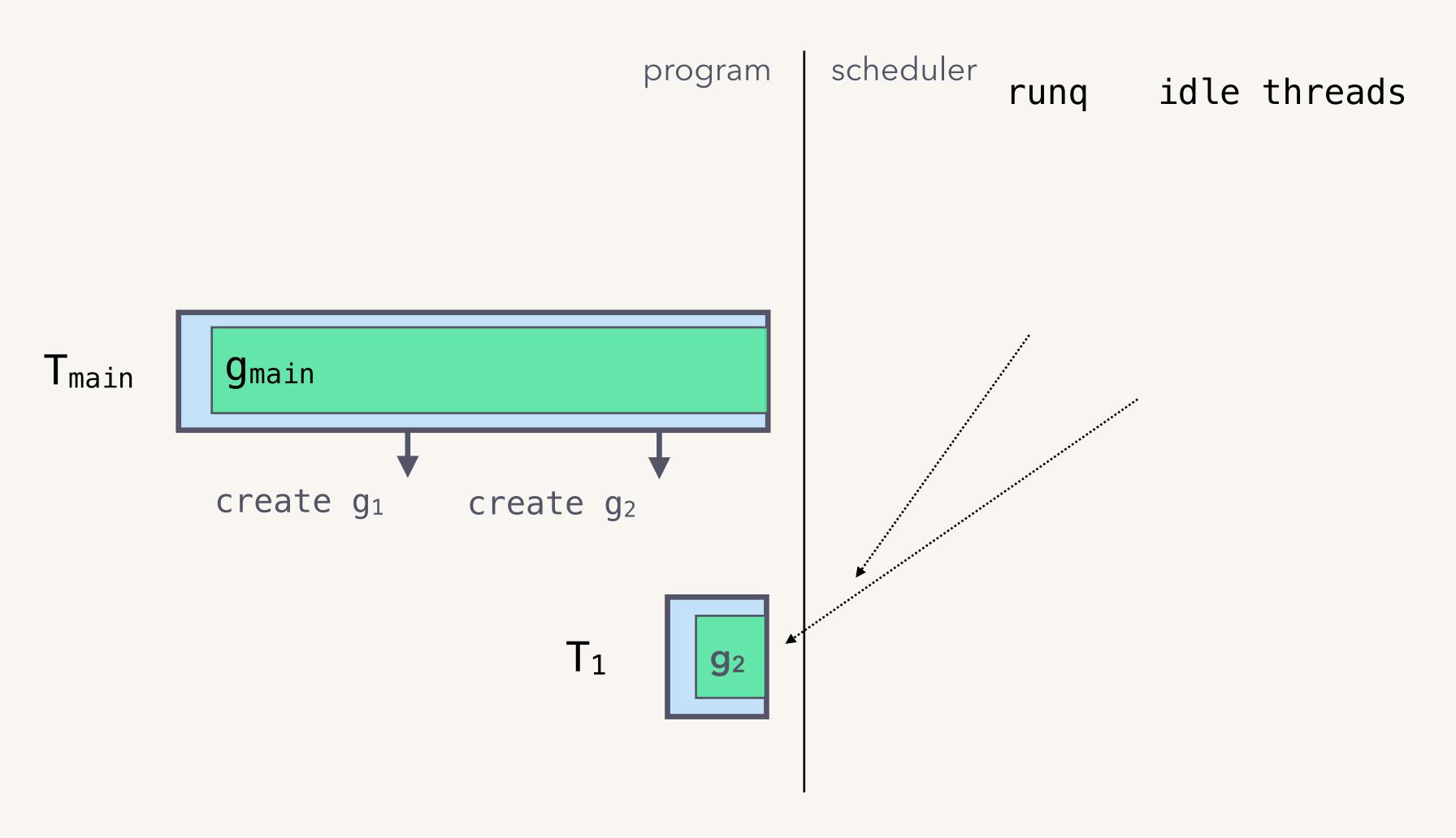




Say g_1 completes, park T_1 rather than destroying it.







a match made in (scheduling) heaven.

We have a scheme that nicely **reduces thread creations** and still provides concurrency, parallelism.

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...but

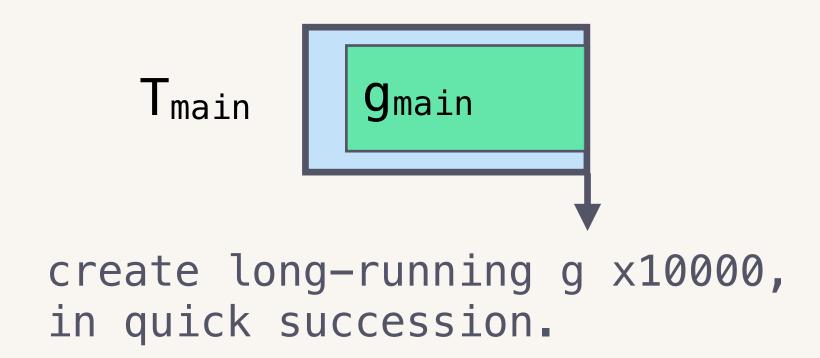
- multiple threads access the same runqueue, so need a lock.

serializes scheduling.

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- multiple threads access the same runqueue, so need a lock.



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- an unbounded number of threads can still be created.

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hella contention possible.

We have a scheme that nicely **reduces thread creations** and still provides concurrency, parallelism.

...but

- multiple threads access the same runqueue, so need a lock.
- an unbounded number of threads can still be created.

hella not scalable.

reusing threads is still a good idea.

thread creation is expensive; reusing threads amortizes that cost.

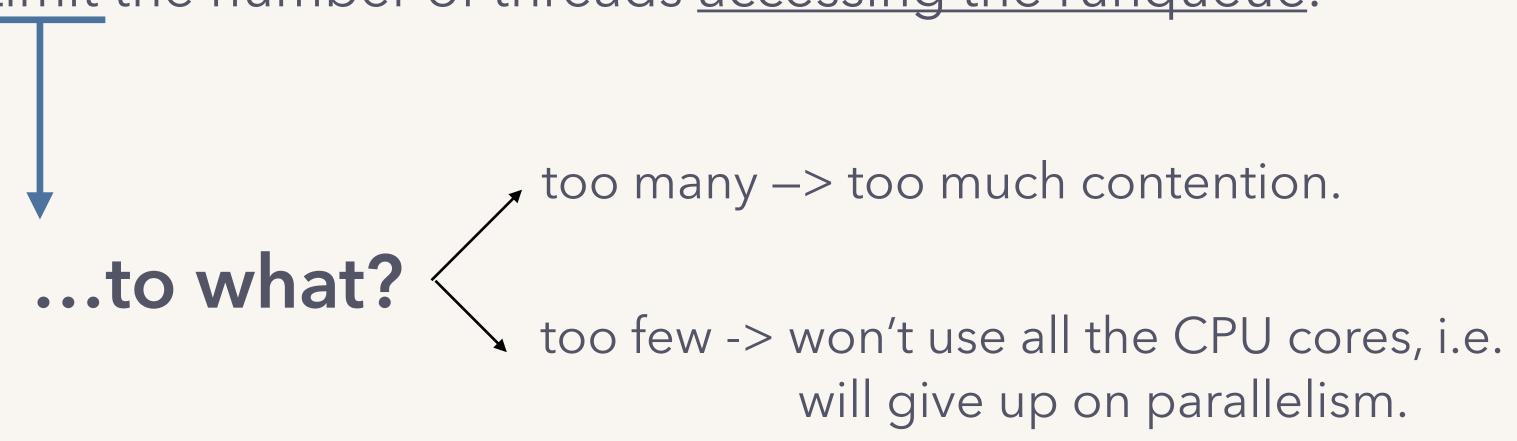
If the problem is an unbounded number threads can access the runqueue...

Limit the number of threads accessing the runqueue. As before, keep threads around for reuse; get goroutines to run from the runqueue.

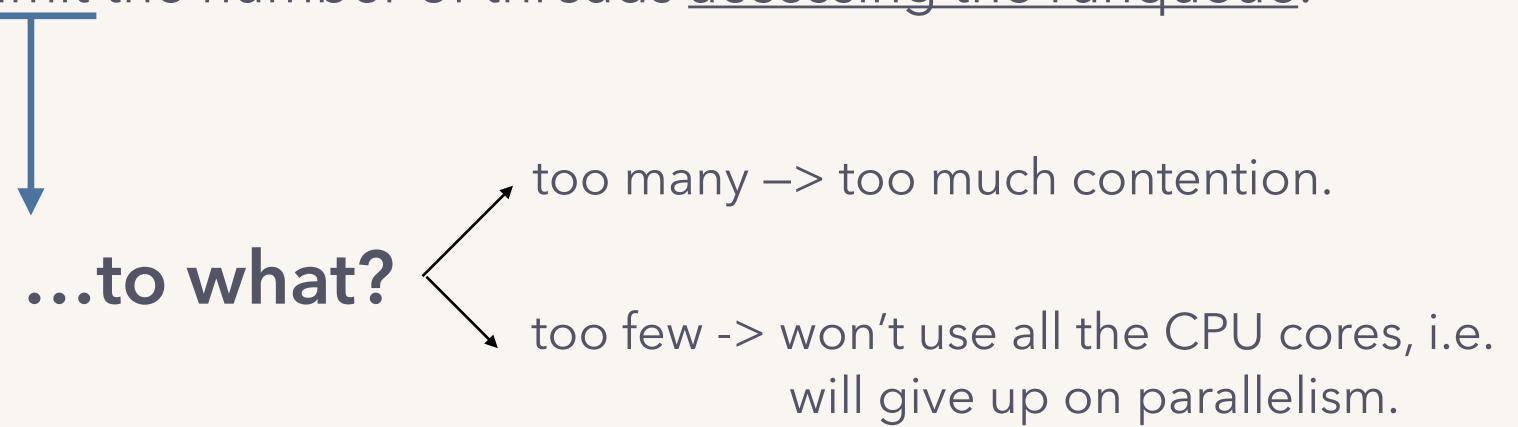
Limit the number of threads accessing the runqueue. As before, keep threads around for reuse; get goroutines to run from the runqueue.

threads that are <u>running goroutines</u>; threads in syscalls etc. <u>won't</u> count towards this limit.

Limit the number of threads <u>accessing the runqueue</u>.



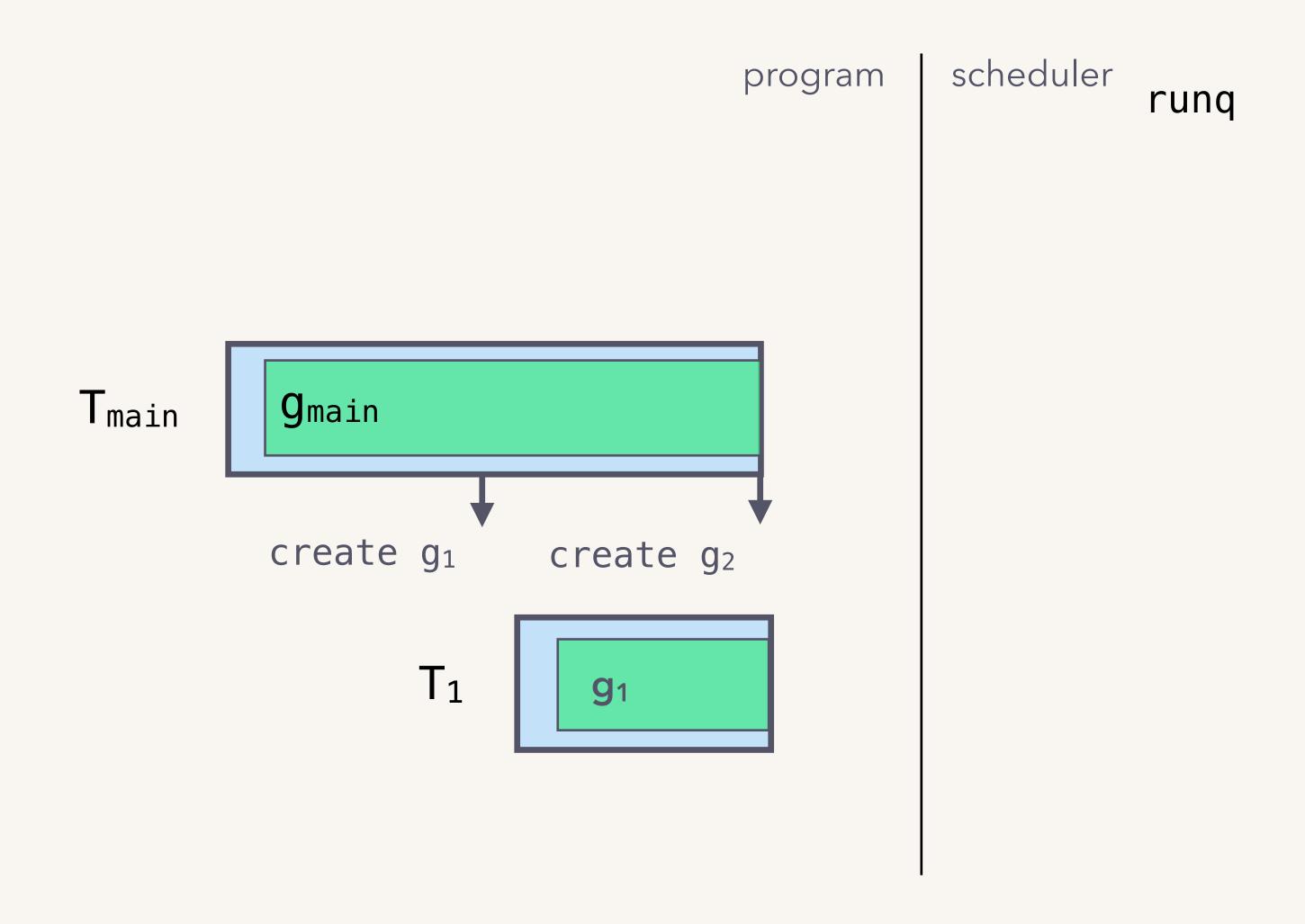
Limit the number of threads <u>accessing the runqueue</u>.



To the number of CPU cores, to get all the parallelism we can!

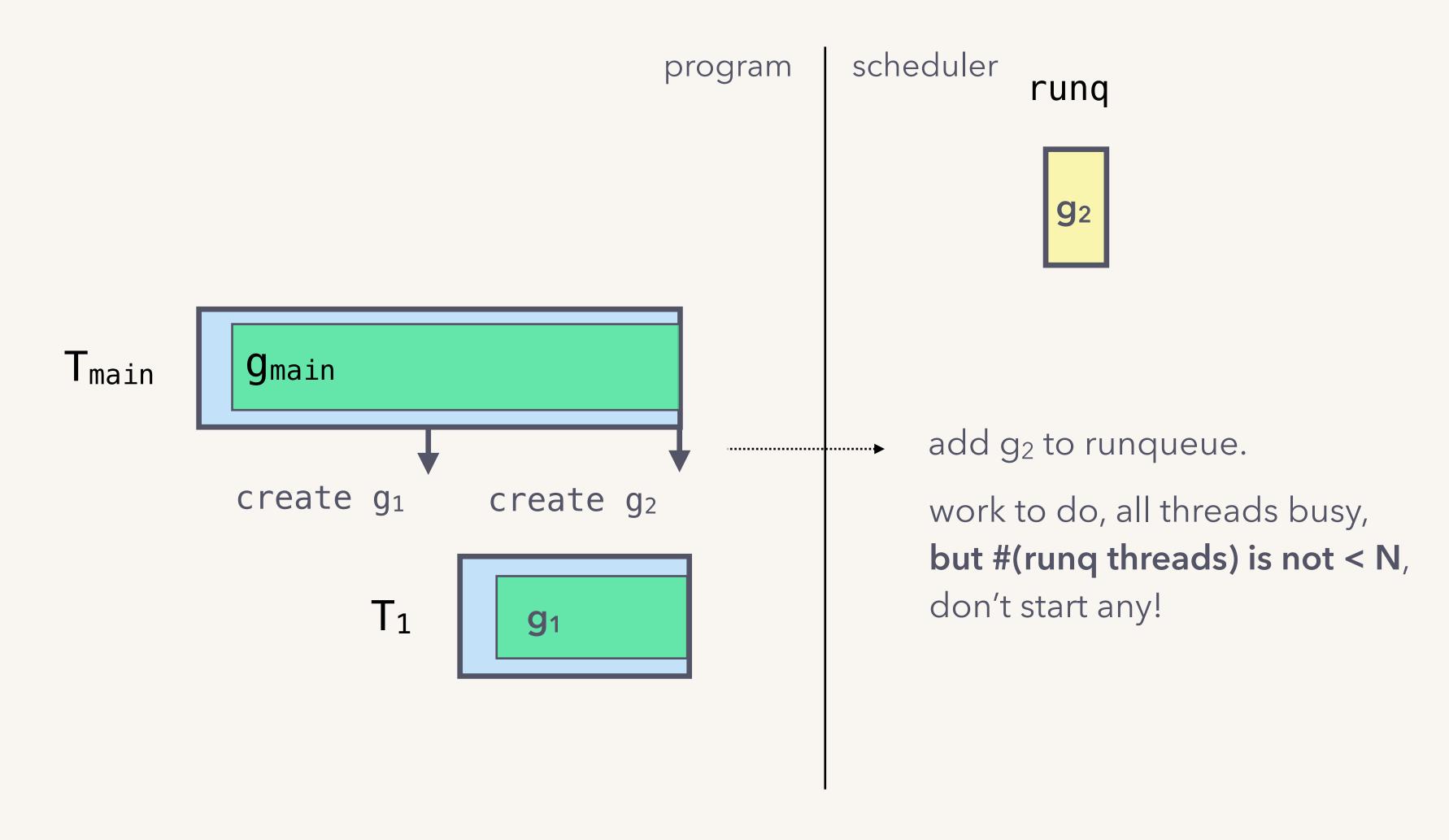


Limit # threads accessing runqueue to number of CPU cores (N) = 2.



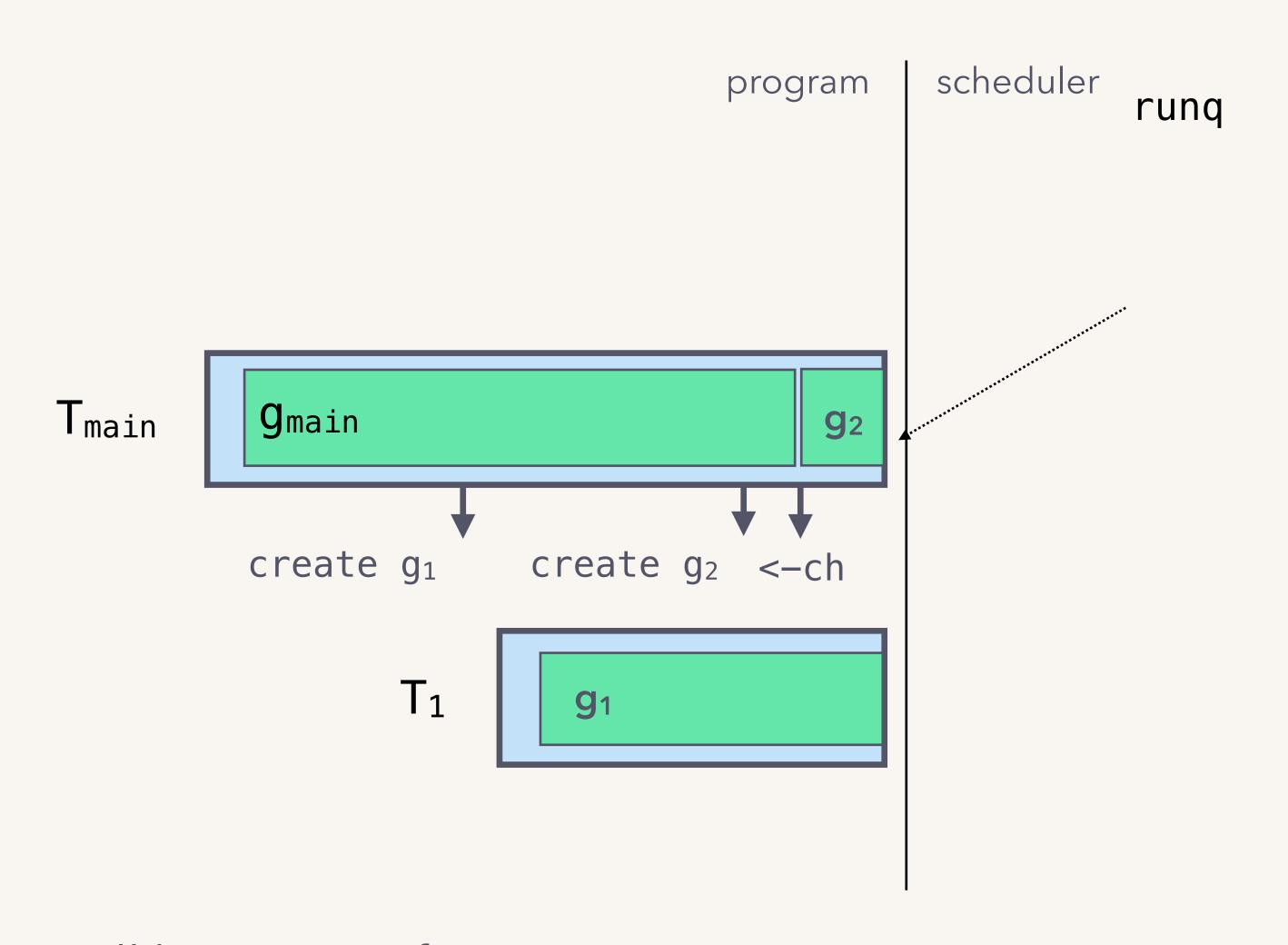
Say T_{main} creates g_{2} , but g_{main} and g_{1} are still running.

Limit # threads accessing runqueue to number of CPU cores (N) = 2.



Say T_{main} creates g_{2} , but g_{main} and g_{1} are still running.

Limit # threads accessing runqueue to number of CPU cores (N) = 2.



g₂ will be run at a future point.

We get around unbounded thread contention, without giving up parallelism.



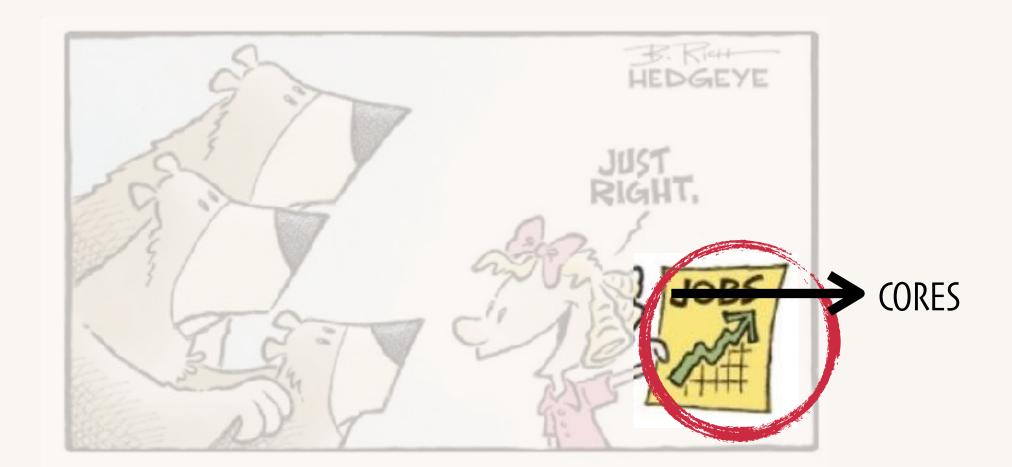
We get around unbounded thread contention, without giving up parallelism.

...ship it?



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We get around unbounded thread contention, without giving up parallelism.

...ship it?

– This scheme does **not** scale with the number of CPU cores! As N $\uparrow \longrightarrow$ number of runqueue-accessing threads \uparrow .

ruh-roh, we're in hella contention land again.

the experiment

the modified Go scheduler:

- uses a global runqueue, and#(goroutine-running threads) = #(CPU cores).
- everything else about the runtime is unmodified.

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the modified Go scheduler:

- uses a global runqueue, and#(goroutine-running threads) = #(CPU cores).
- everything else about the runtime is unmodified.

the benchmark:

- CreateGoroutineParallel, in the go repo.
- creates #(CPU cores) goroutines in parallel, until a total of b.N goroutines have been created.

the machines:

A 4-core and 16-core x86-64.

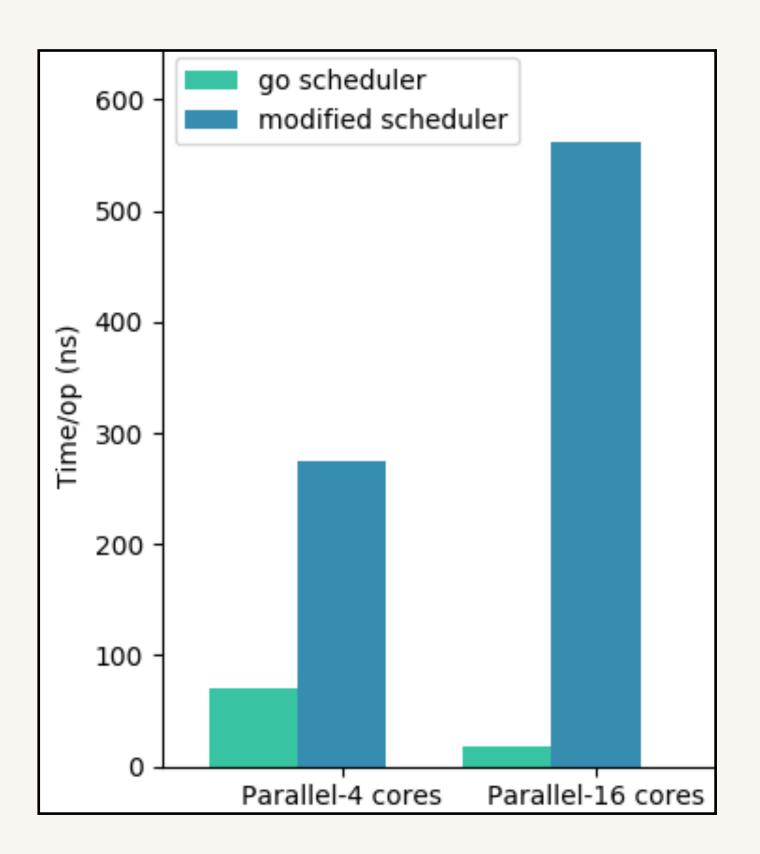
the experiment

On the 4-core:

the modified scheduler takes about 4x longer than the Go scheduler.

On the 16-core:

the modified scheduler takes about 31x longer than the Go scheduler!



scheduler benchmarks (CreateGoroutineParallel)

We get around unbounded thread contention, without giving up parallelism.

...ship it? nope.

– This scheme does **not** scale with the number of CPU cores! As N $\uparrow \longrightarrow$ number of runqueue-accessing threads \uparrow .

ruh-roh, we're in hella contention land again.

#(goroutine-running threads) = #(CPU cores) is still clever.
we maximally leverage parallelism by this.

really, the problem is the single shared runqueue.

idea III: distributed runqueues

Use N runqueues on an N-core machine.

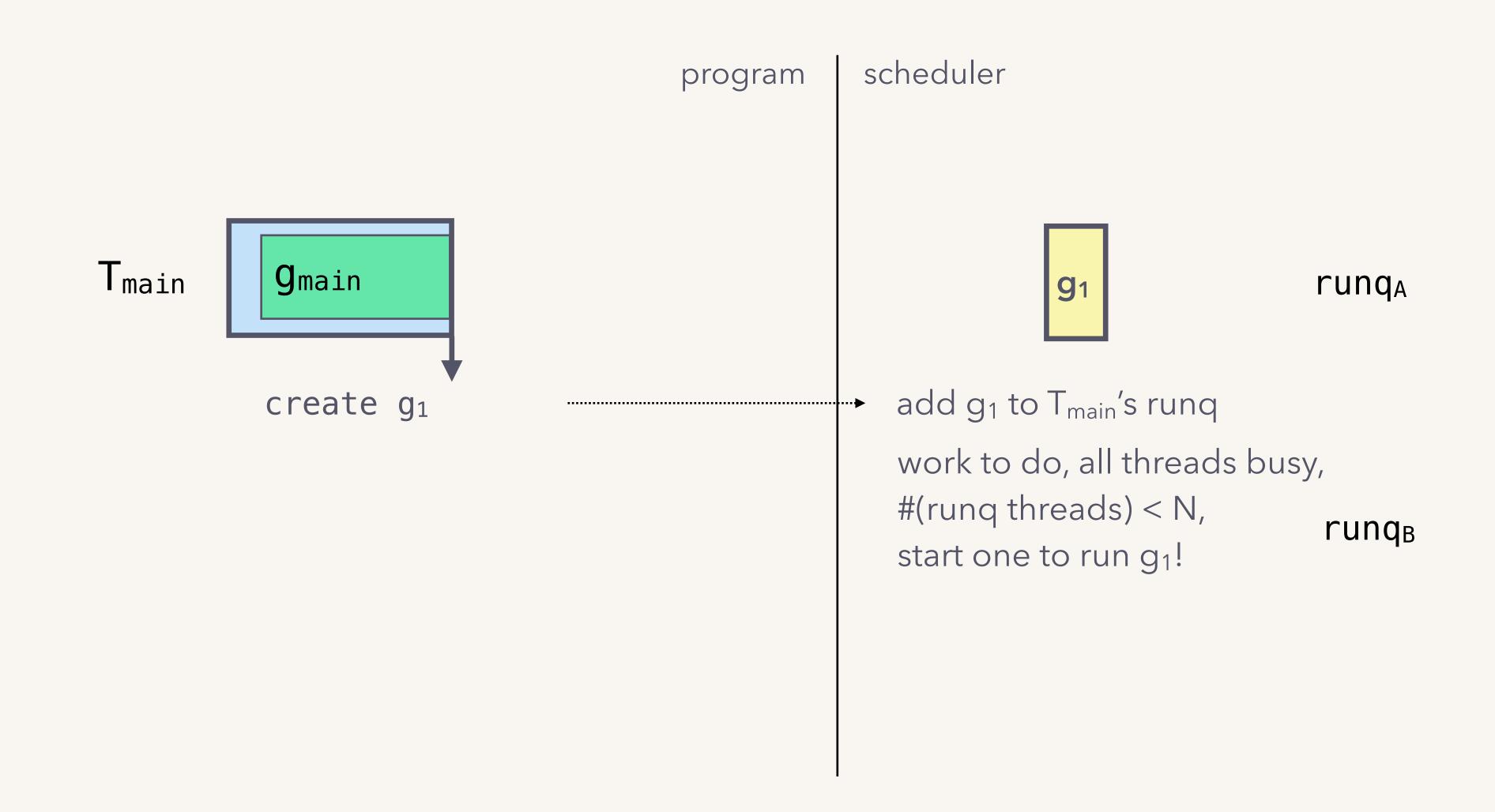
idea III: distributed runqueues

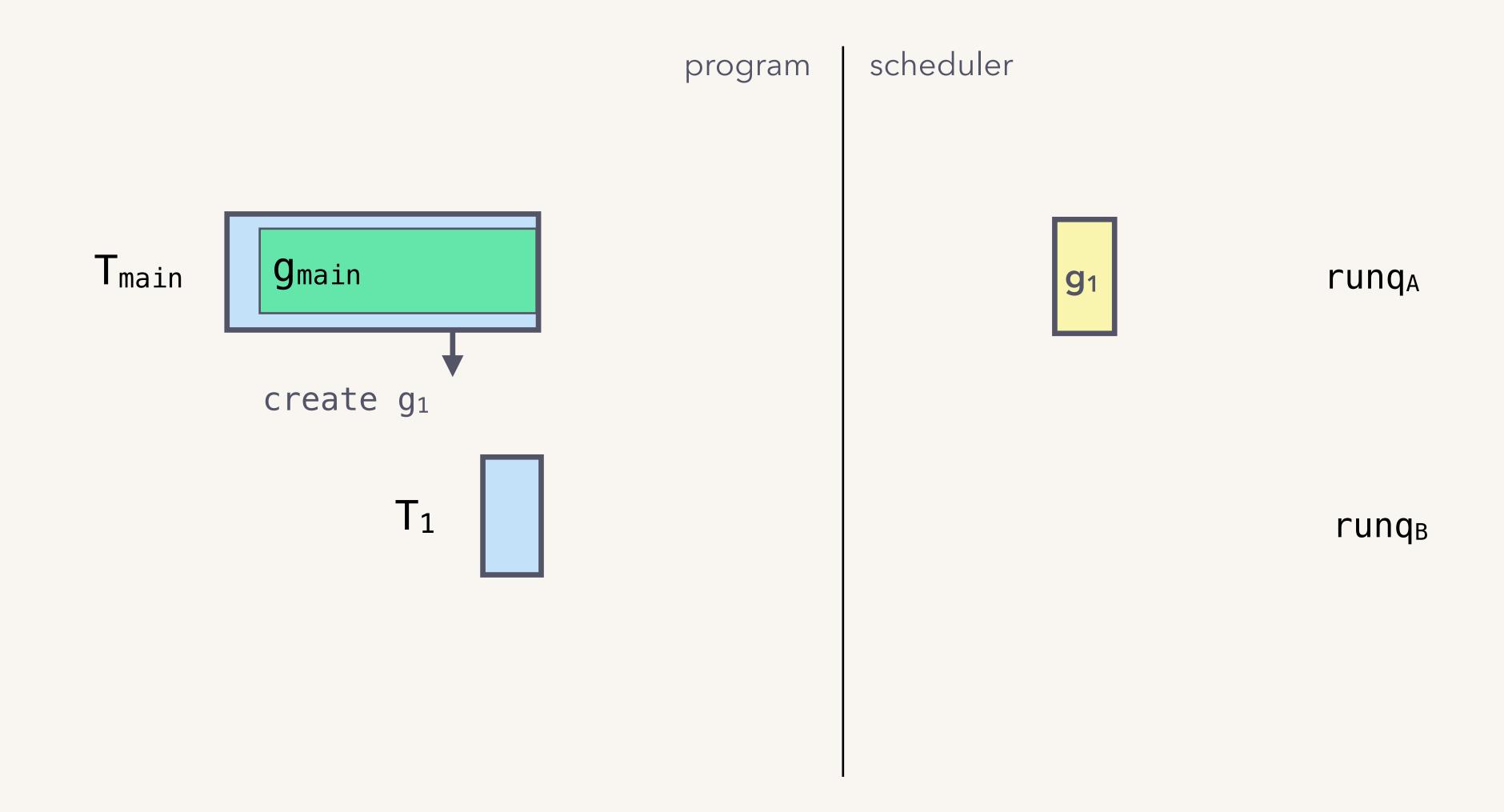
Use N runqueues on an N-core machine.

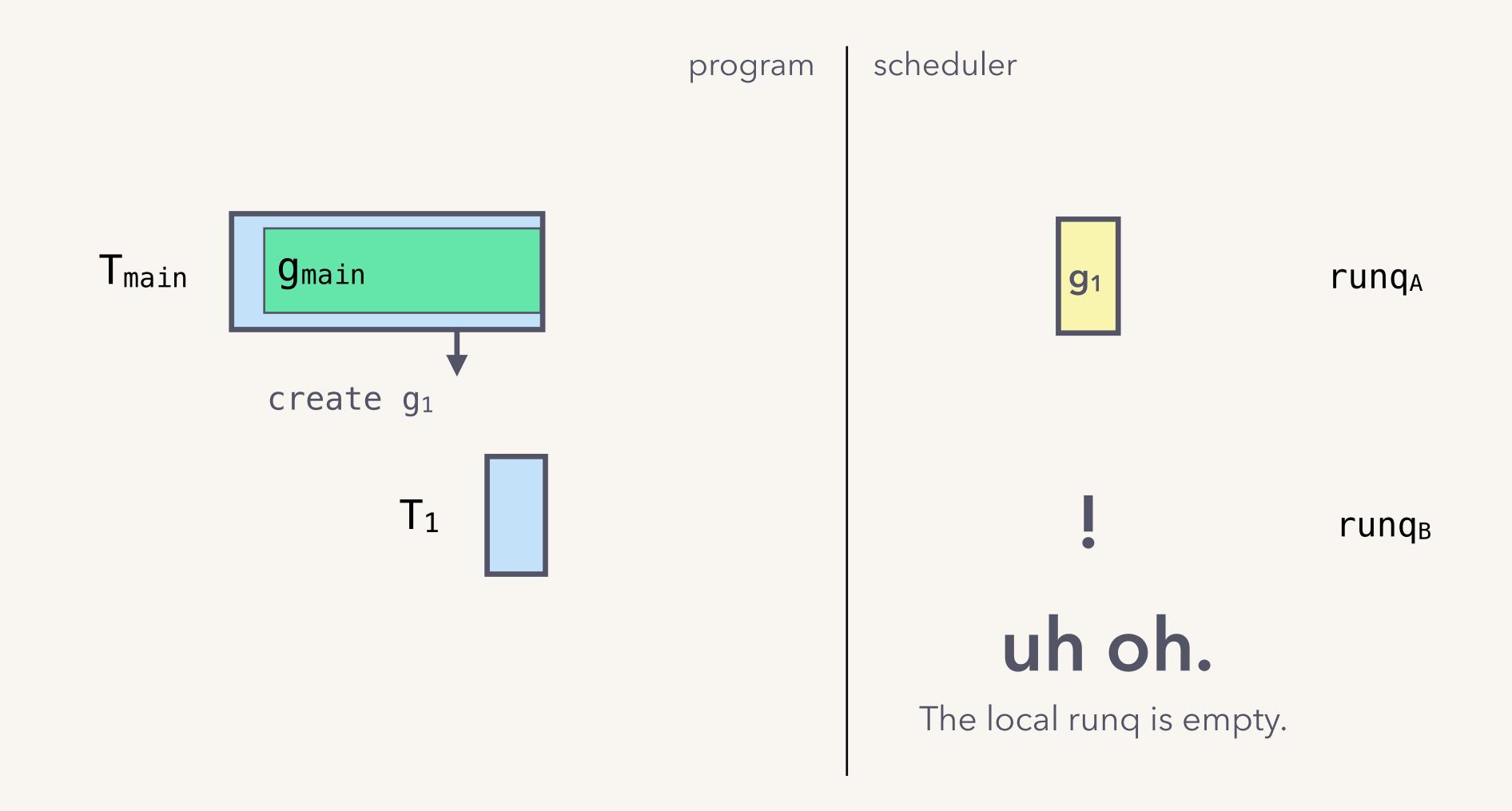
A thread claims a runqueue to run goroutines.

it inserts and removes goroutines from the runqueue it is **associated with**.

As before, reuse threads.







so, steal!

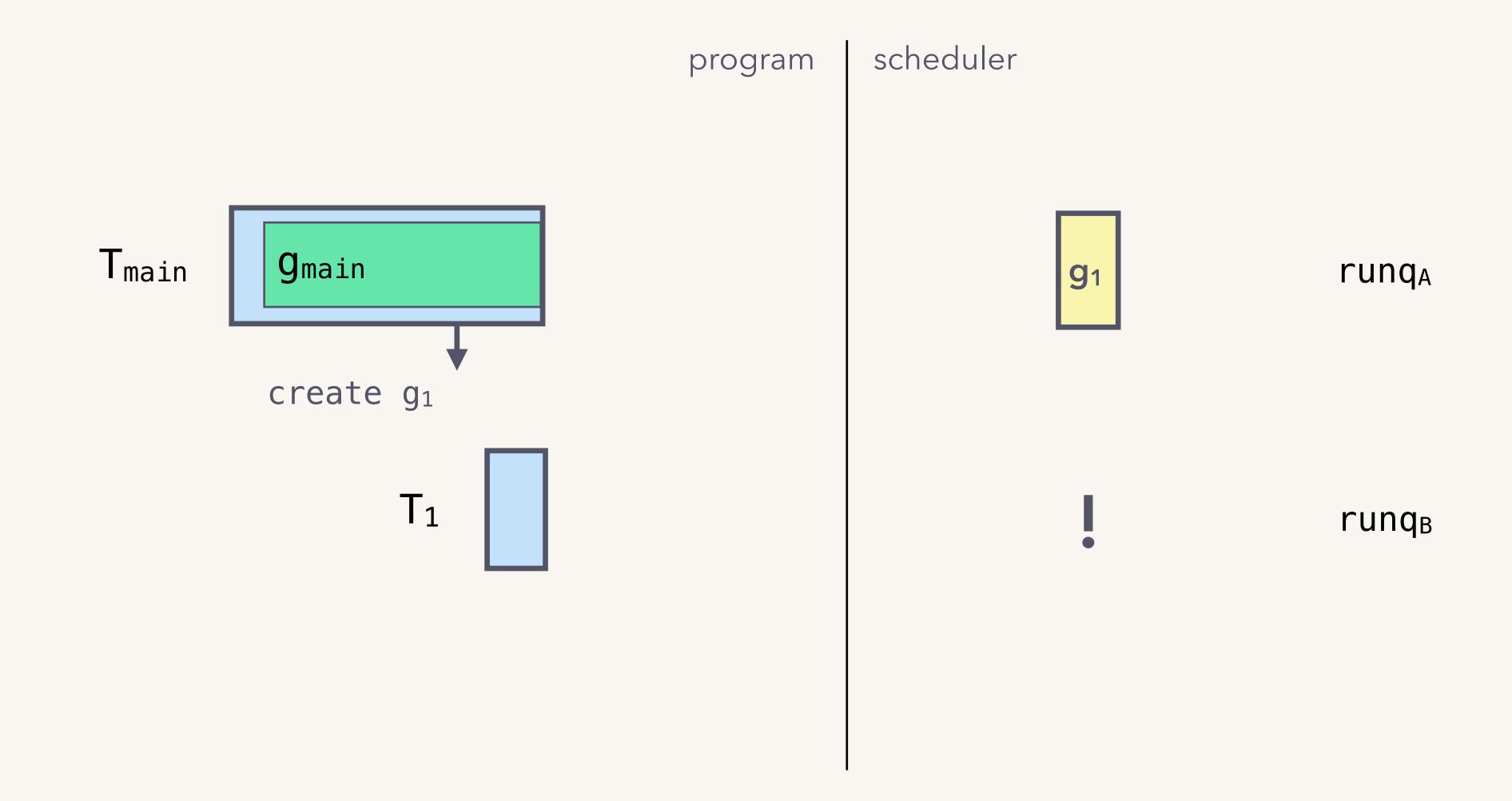
If the local runqueue is empty, steal work from another runqueue.

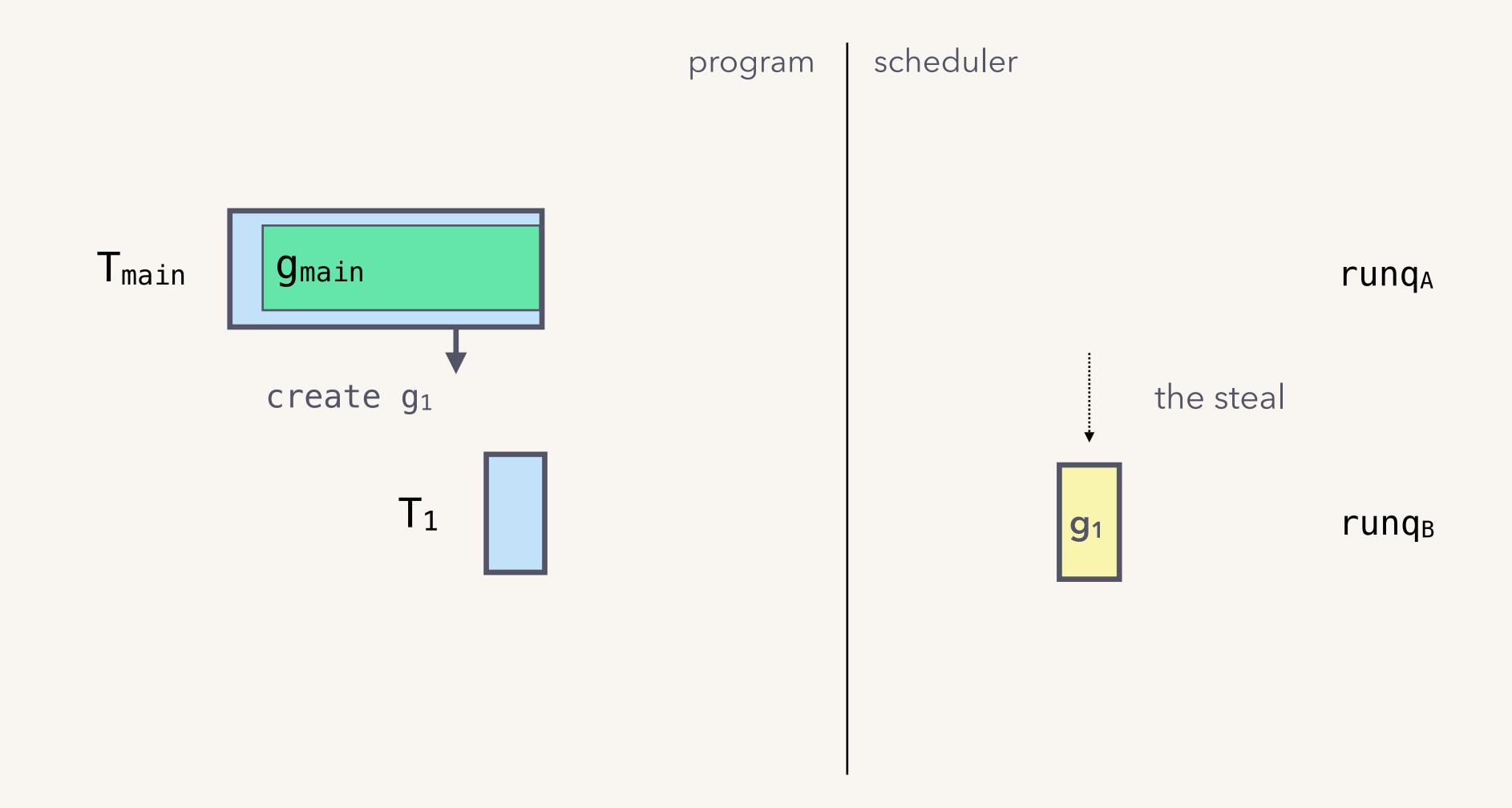
"work stealing"

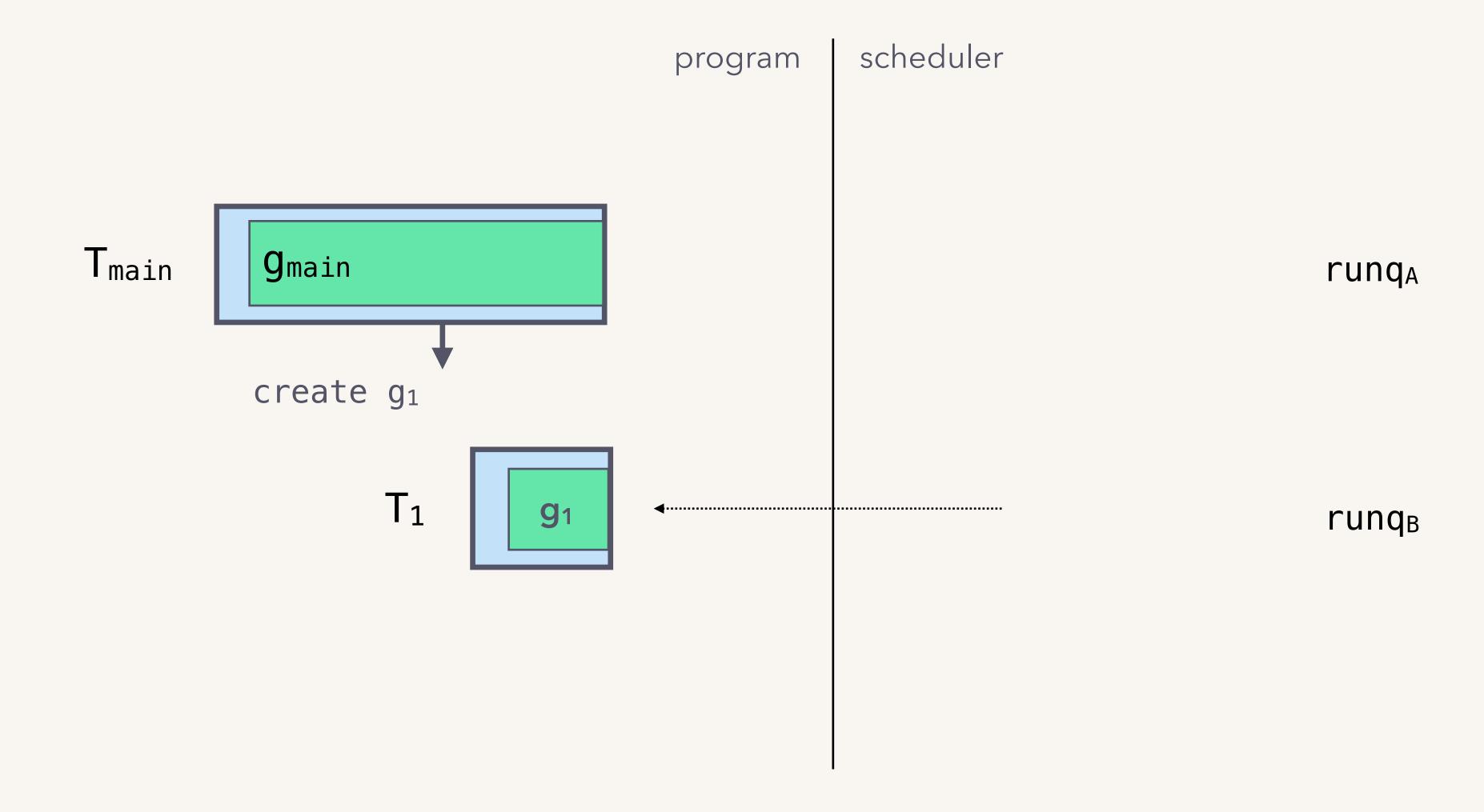
pick another runqueue at random, steal half its work.

so, steal!

If the local runqueue is empty, **steal work** from another runqueue. It organically **balances work** across threads.







"the end justifies the means"?

this looks promising!

This scheme **scales nicely** with the number of CPU cores, and threads don't contend for work.

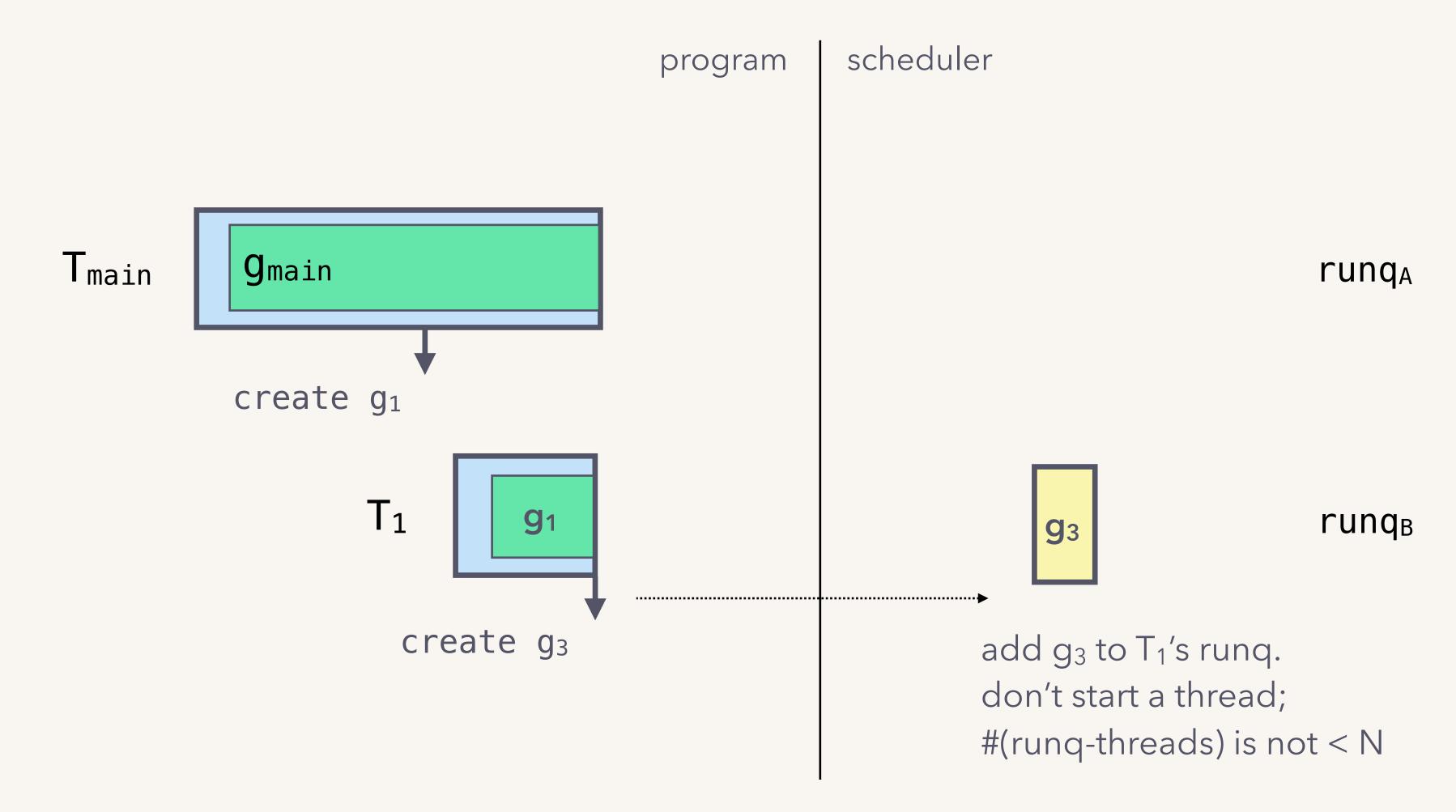
The work across threads is <u>balanced</u> with work-stealing.

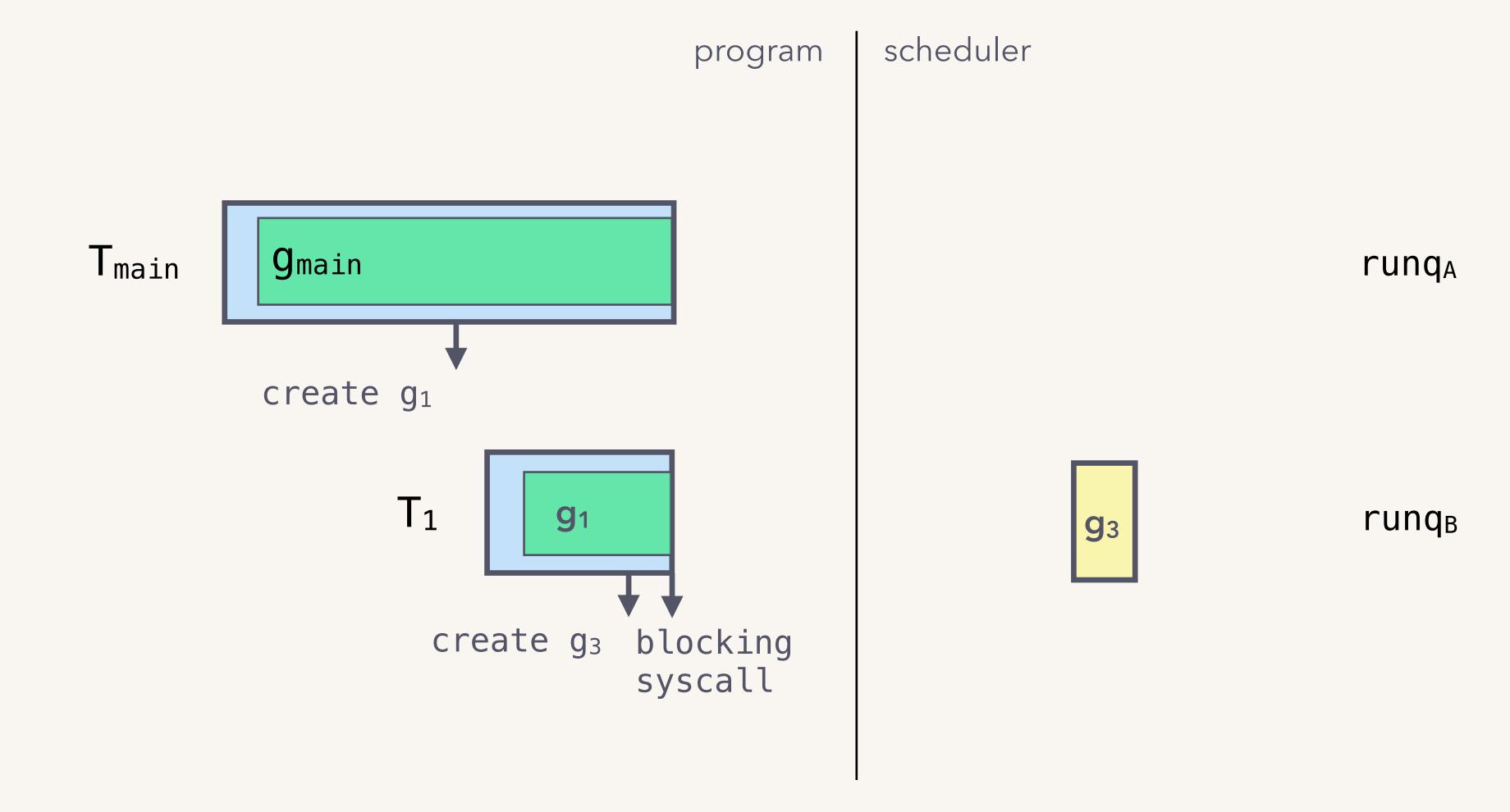
let's continue.

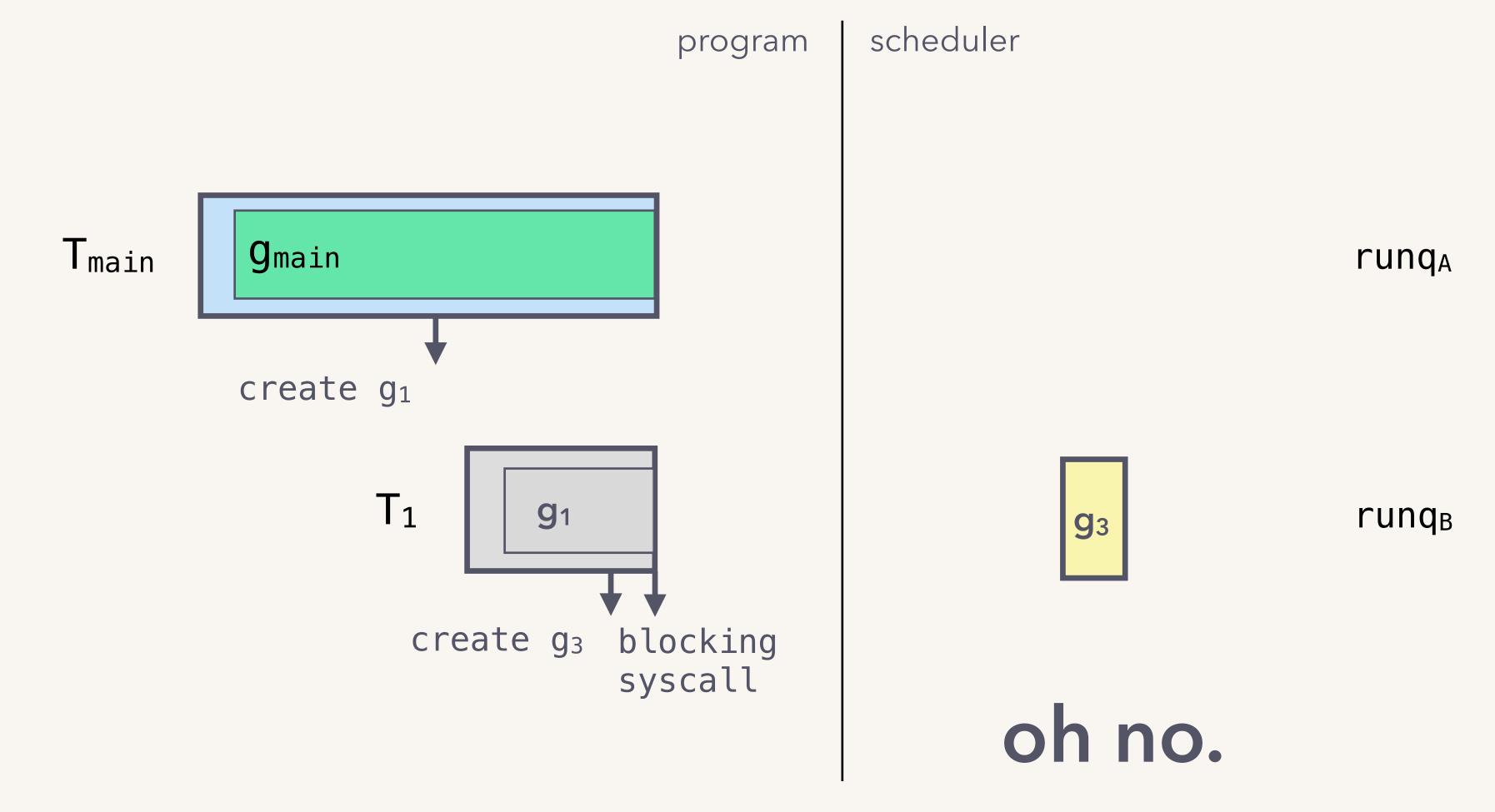
```
func process(image) {
    // Create goroutine.
    go reportMetrics() creates g3

    complicatedAlgorithm(image)

    // Write to file.
    f, err := os.OpenFile() goroutine & thread block
    ...
}
```







The runqueue has work, and the thread's blocked.

"handoff"

Use a mechanism to transfer a blocked thread's runqueue to another thread.

a <u>background monitor thread</u> that <u>detects</u> threads blocked <u>for a while</u>, takes and gives the runqueues away.



Why can't the thread <u>itself</u> handoff the runqueue, before it enters the system call?

If it did, it could give up its runqueue unnecessarily!

"handoff"

Use a mechanism to **transfer a blocked thread's runqueue** to another thread.

Unpark a parked thread or start a thread if needed.

this is okay to do!

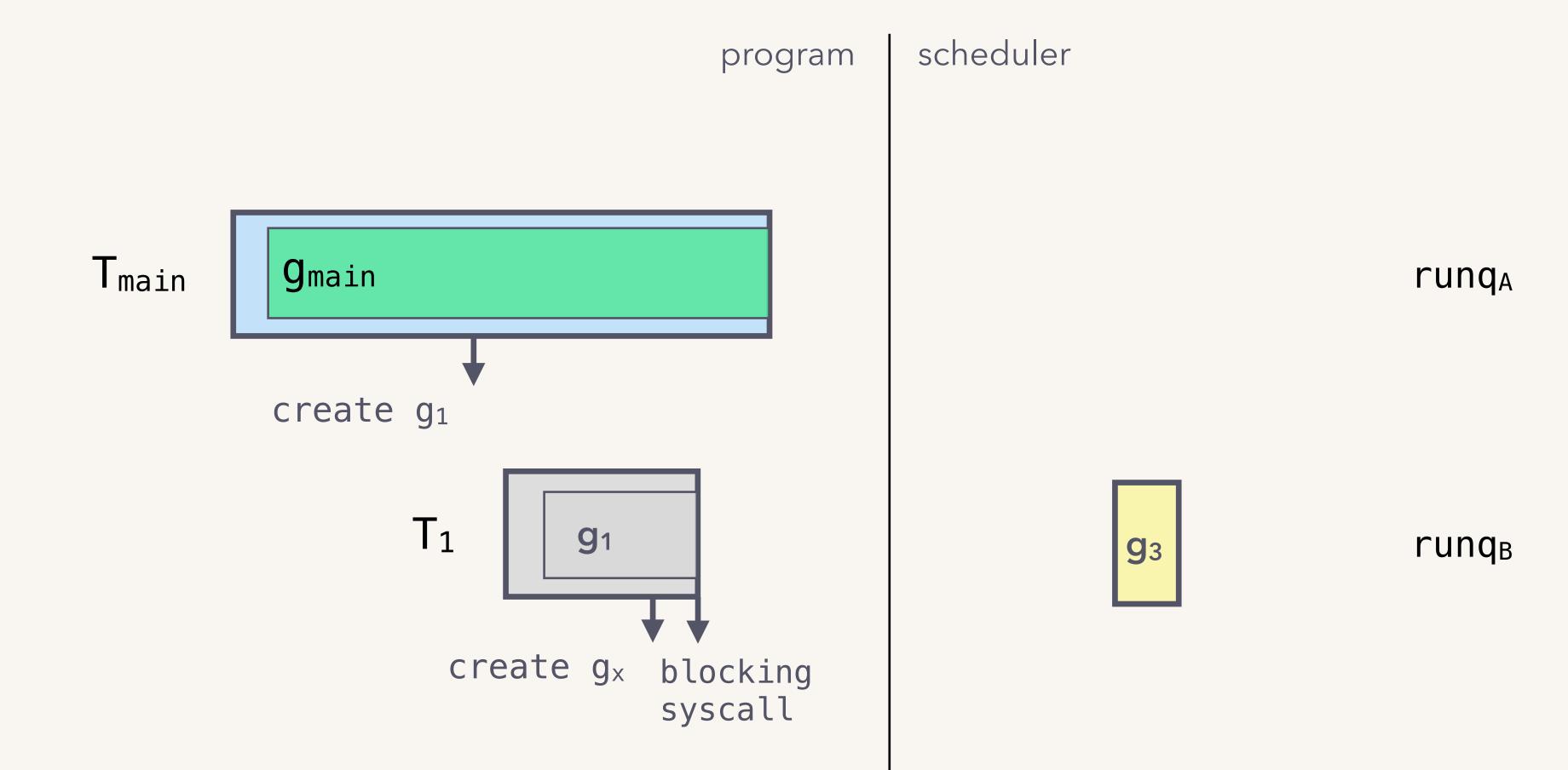
The thread limit (= number of CPU cores) applies to goroutine-running threads only.

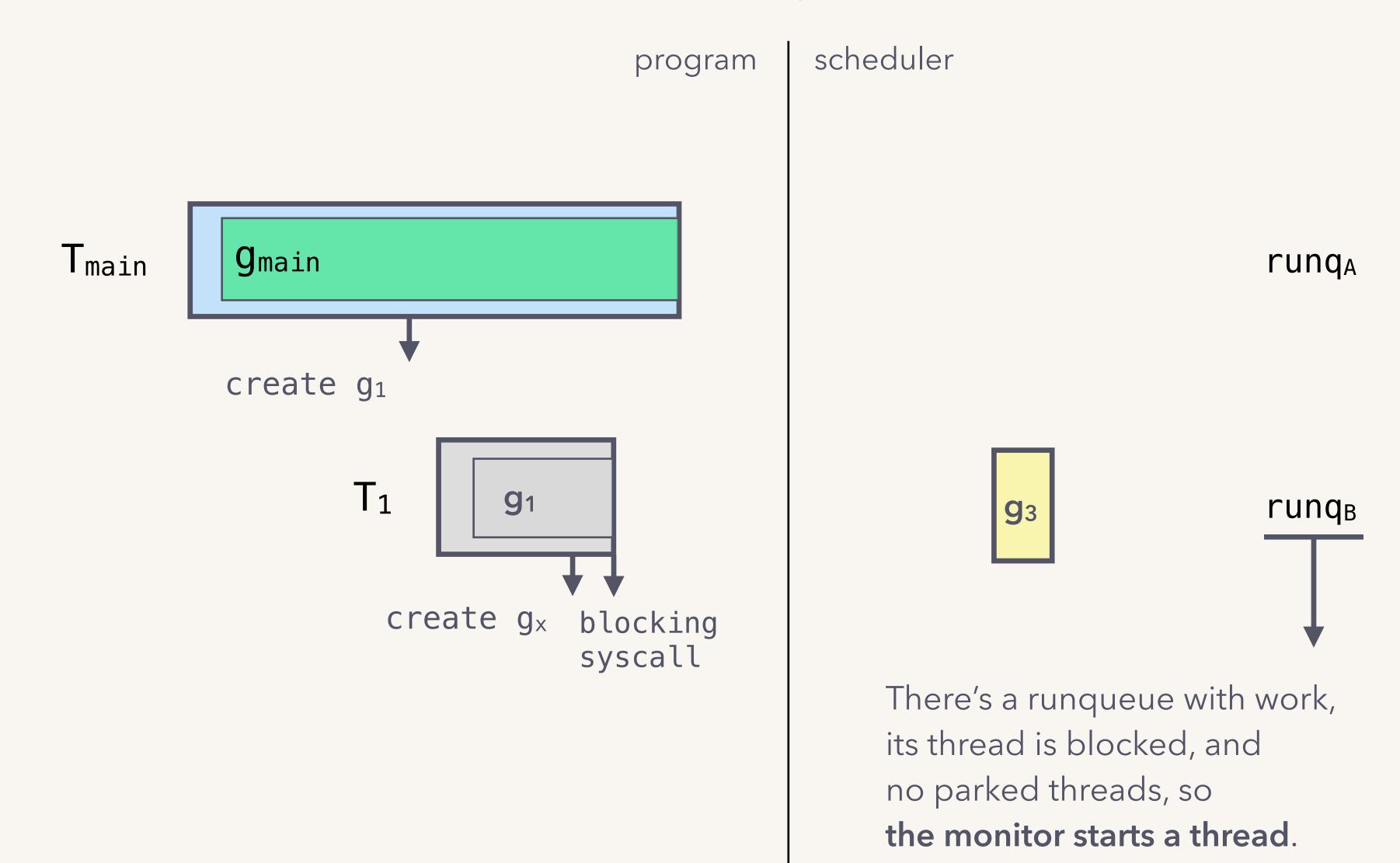
The original thread is blocked; so, another thread can <u>take its place</u> running goroutines.

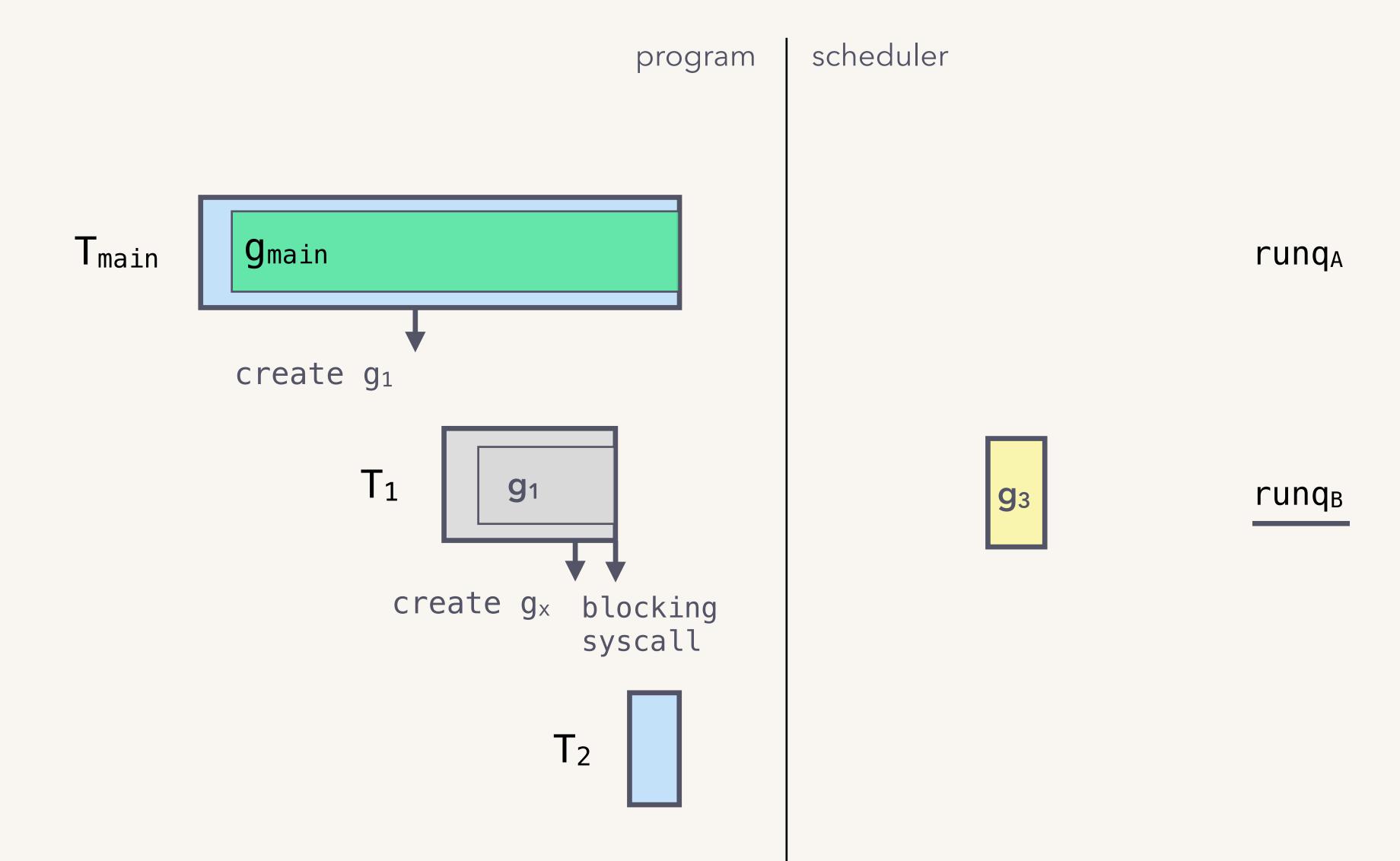
"handoff"

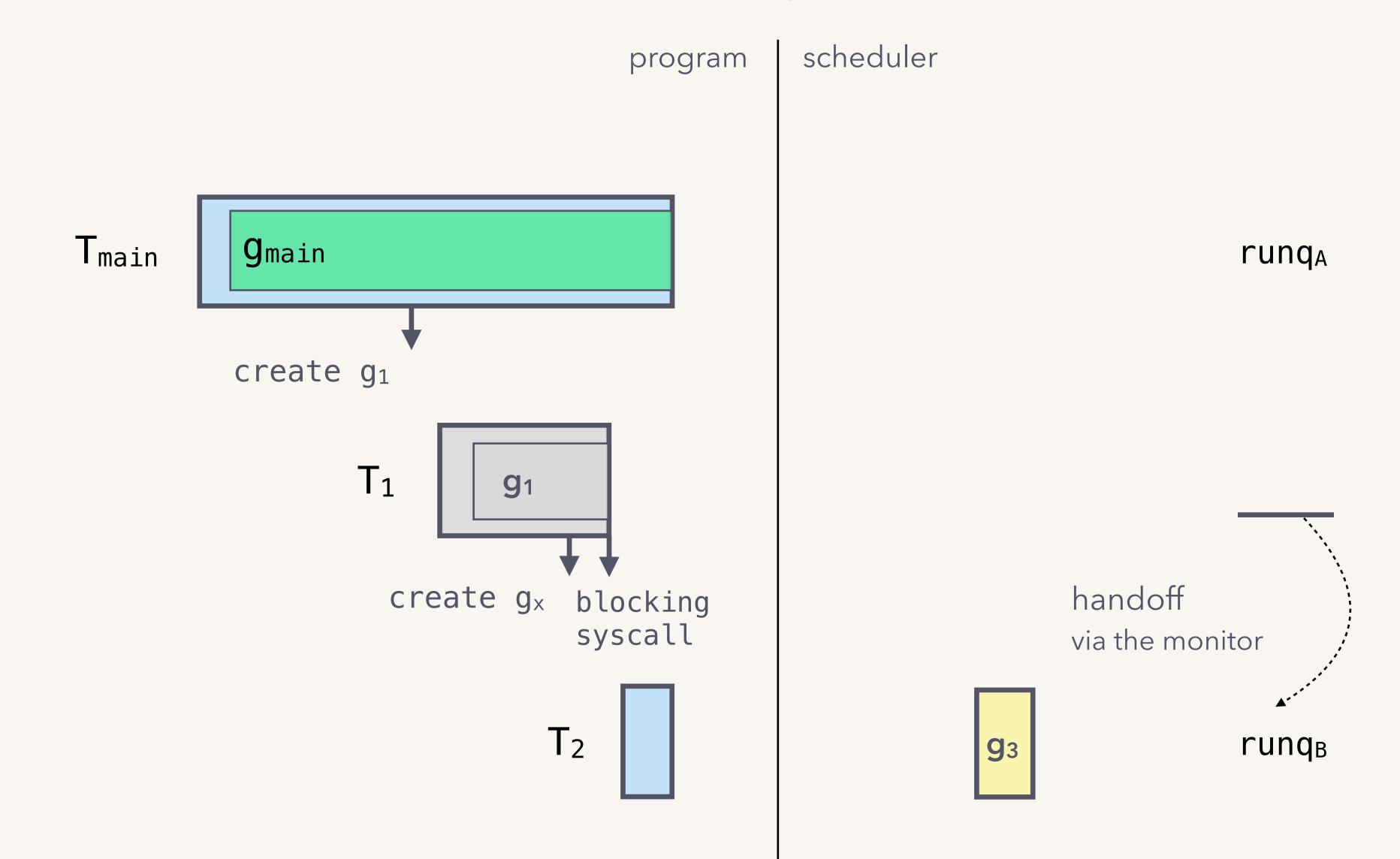
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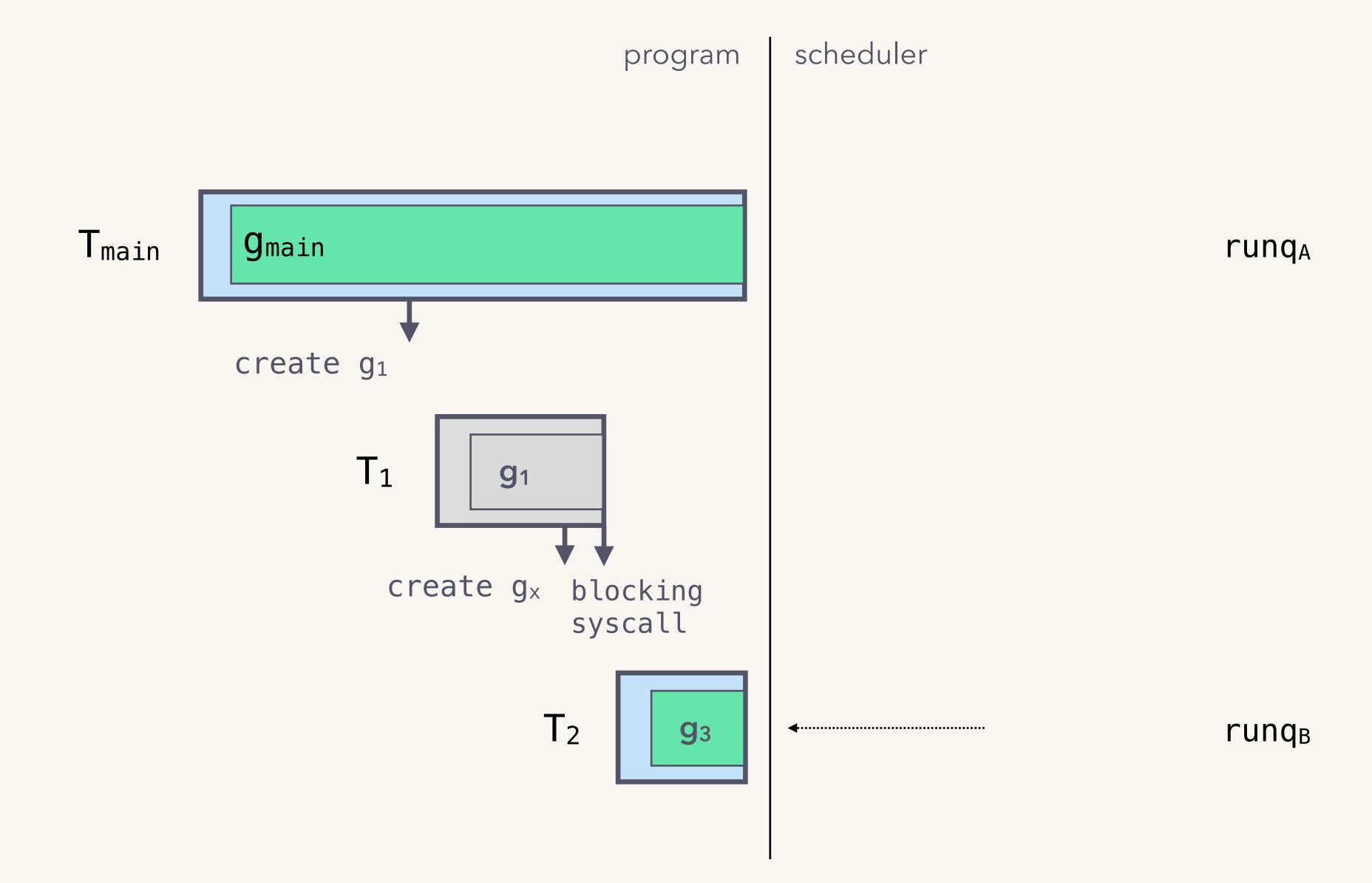
Prevents goroutine starvation.











this looks promising!

This scheme **scales nicely** with the number of CPU cores, and threads don't contend for work.

The work across threads is <u>balanced</u> with work-stealing; handoff <u>prevents starvation</u> from blocked threads.

we have (finally) arrived.

the Go scheduler

the big ideas.

reuse threads.

the Go scheduler

GOMAXPROCS

the big ideas.

limit #(goroutine-running) threads to
number of CPU cores.

reuse threads.

the Go scheduler

distributed runqueues with stealing and handoff.

the big ideas.

limit #(goroutine-running) threads to number of CPU cores.

GOMAXPROCS

reuse threads.

...and one sneaky idea.

The scheduling points are **cooperative** i.e. <u>the program</u> calls into the scheduler.

```
// A CPU-bound computation that runs
// for a long, long time.

func complicatedAlgorithm(image) {
   // Do not create goroutines, or do
   // anything the blocks at all.
}
```

ruh-roh.

a CPU-hog can starve runqueues

To avoid this, the Go scheduler implements preemption*.

It runs a <u>background thread</u> called the "sysmon", to detect <u>long-running goroutines</u> (> 10ms; with caveats), and unschedule them when possible.



^{*} technically, cooperative preemption.

To avoid this, the Go scheduler implements **preemption***.

...where would preempted goroutines be put?

They essentially <u>starved</u> other goroutines from running, so don't want to put them back on the per-core runqueues; it would <u>not be fair</u>.



^{*} technically, cooperative preemption.

...on a global runqueue.

that's right.

The Go scheduler has a global runqueue in addition to the distributed runqueues.



...on a global runqueue.

It uses this as a lower priority runqueue.

Threads access it <u>less frequently</u> than their local runqueues; so, contention is not a real issue.



a neat detail (or two)...

thread spinning

- ▶ Threads without work "spin" looking for work before parking; they check the global runqueue, poll the network, attempt to run gc tasks, and work-steal.
- ▶ This burns CPU cycles, but maximally leverages available parallelism.

Ps and runqueues

- ▶ The per-core runqueues are stored in a heap-allocated "p" struct.
- ▶ It stores other resources a thread needs to run goroutines too, like a memory cache.
- ightharpoonup A thread claims a p to run goroutines, and the entire p is handed-off when it's blocked.

Fun fact: this handoff is taken care of by the sysmon too.

assess it.

the difficult questions.

#schedgoals

for scheduling goroutines onto kernel threads.

use a small number of kernel threads.

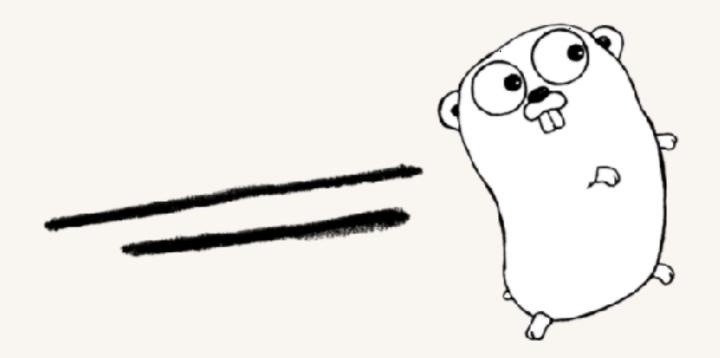
ideas: reuse threads & limit the number of goroutine-running threads.

support high concurrency.

ideas: threads use independent runqueues & keep them balanced.

☑ leverage parallelism i.e. scale to N cores.

ideas: use a runqueue per core & employ thread spinning.



limitations

FIFO runqueues → no notion of goroutine priorities.

Implement runqueues as priority queues, like the Linux scheduler.

No strong preemption \rightarrow no strong fairness or latency guarantees.

recent proposal to fix this: Non-cooperative goroutine preemption.

Is not aware of the system topology \rightarrow no real locality.

dated proposal to fix this: NUMA-aware scheduler

Use LIFO, rather than FIFO, runqueues; better for cache utilization.



The Go scheduler motto, in a picture.

References

Scalable scheduler design doc

https://github.com/golang/go/blob/master/src/runtime/runtime2.go

https://github.com/golang/go/blob/master/src/runtime/proc.go

Go scheduler blog post

Scheduling Multithreaded Computations by Work Stealing

@kavya719

speakerdeck.com/kavya719/the-scheduler-saga

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