# Schedulers

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# **Threads and Schedules**

A *scheduler* is an operating system component that decides which thread runs on which processing unit. In this note, from now on, we say 'core' rather than the longer 'processing unit'. As an example, consider a situation in which we have 2 cores, and the following requests:

- 1. at time 1, thread A starts to run; it will finish after it gets to run for 3 time units
- 2. also at time 1, thread B start to run; it will finish after it gets to run for 2 time units
- 3. at time 2, thread C starts to run; it will finish after it gets to run for 4 time units
- 4. at time 3, thread D starts to run; it will finish after it gets to run for 1 time unit
- 5. and finally, at time 6, thread E starts to run; it will finish after it gets to run for 1 time unit

Given such a list of requests, a scheduler must find a *schedule*: for each unit of time, which thread executes on which core. For example, the figure below illustrates three possible schedules for the requests above:



Below the time axis, we have labels of the form (*thread*, *duration*), which correspond to the events listed above. The time units are arbitrary: for an operating system like Linux, the time unit is ~ 10 ms. Let's look at the label (D, 1), which is under time 3. It says that D requires one unit of time. Indeed, in schedule 1, thread D runs on core 1 in the time interval (4, 5); in schedule 1, it runs on core 1 in the time interval (4, 5); and in schedule 2, it runs on core 2 in the time interval (3, 4). Notice that all intervals are after time 3 when the request arrived.

#### **Properties of Schedules**

Schedules have several characteristics, such as response time, (core) utilisation, and context switching.

The *response time* of one thread in a given schedule is the time passed since the thread requests to start until it thread finishes. The *total response time* of a schedule is the sum of the response time of all the threads in that schedule. The *delay* of one thread in a given schedule is the difference between the response time and

the duration that thread runs. The *total delay* of a schedule is the sum of the delays of all the threads in that schedule. For example, in the example above, the request times, the finish times, the response times, and the delays are as follows:

			F	Finish		Re	Response			Delay		
Thread	Request	Runtime	1	2	3	1	2	3	1	2	3	
A	1	3	4	4	4	3	3	3	0	0	0	
В	1	2	3	4	3	2	3	2	0	1	0	
С	2	4	7	7	7	5	5	5	1	1	1	
D	3	1	5	5	4	2	2	1	1	1	0	
Е	6	1	7	7	7	1	1	1	0	0	0	
Total						13	14	12	2	3	1	

We see that schedule 3 has the smallest total response time and the smallest total delay. So, schedule 3 is the best with respect to response times.

Another way to evaluate schedules is to look at core utilisation. The *utilisation* of a core is the number of time steps it was active (non-idle) divided by the total number of steps. The *total utilisation* of a computer is the sum of utilisations over all cores. (Sometimes the term 'load' is used instead of 'utilisation'.) In our example, the total utilisation is 1.8(3) for all three schedules. In general, higher utilisation indicates that less time is wasted, with cores being idle and not doing work.

Finally, another way to evaluate schedules is to count context switches. A *context switch* is a transition from one thread to another, on one core, ignoring idle times. So, for example, core 1 in schedule 1 has one context switch  $A \rightarrow D$ , and one context switch  $D \rightarrow E$ . In total, schedules 1, 2, 3 have, respectively, 3, 9, and 4 context switches. We care about context switches because they imply delays: for example, the caches local to one core are not that helpful after a context switch. So, schedule 1 is the best with respect to the number of context switches.

#### **Real Time**

As we saw, there are several measures we can use to gauge how good schedules are. We can also combine several measures. For example, we could say that schedule *X* is better than schedule *Y* when the total delay of *X* is smaller than the total delay of *Y*, or the total delays are equal but *X* has a smaller maximum delay per thread.<sup>1</sup> *Real time applications* are those which strongly prefer schedules with small maximum delays per thread. *Hard real time applications* have a deadline: all schedules with a maximum delay exceeding the deadline just as bad — they are unusable. That is, if two schedules both exceed the deadline, then it makes no sense to say which of them is better. *Soft real time applications* are real time applications that are not hard.<sup>2</sup>

Real time applications usually produce periodic requests for the scheduler. For example, Skype might have a thread that every 50 ms compresses the audio data captured in the previous 50 ms. This leads us to an interesting problem. Suppose that compressing 50 ms of audio data takes *T* ms. Can we find a schedule? Well, it depends on *T*, but also on the number of cores *N*. An easy way to tell is as follows: It is possible if and only if the total utilisation is  $\leq N$ . But, how total utilisation is a property of a schedule: How can we compute it if we don't even know whether a schedule exists? Since the requests are periodic, it is reasonable to expect that if a schedule exists then a periodic schedule exists. Now, if we look at a long enough time of *D* ms, for any schedule, the number of requests will be D/50 and the nonidle time will be  $DT/50 \pm NT$ . The error can't be bigger than *NT*. (Exercise: Why?) And, of course, the time available to each core is *D*. Thus, total utilisation is

TODO: prove

$$\frac{\frac{DT}{50} \pm NT}{D} = \frac{T}{50} \pm \frac{NT}{D}$$

Since this is true for any *D* (we chose it arbitrarily), we just let  $D \rightarrow \infty$  to make the error arbitrarily small. Finally, we get that the total utilisation is T/50, as we'd have guessed immediately if wouldn't have wanted to

<sup>&</sup>lt;sup>1</sup> More briefly, we'd say we use the lexicographic order on (total delay, maximum delay).

<sup>&</sup>lt;sup>2</sup> One could still use a deadline with soft real time applications. In that case, schedules would use the lexicographic order on (count of deadline misses, maximum deadline, something else).

check more carefully. And here is the simple criterion: Total utilisation cannot exceed the number of cores. If it does, we say that the requests are *not schedulable*.

## Schedulers

Now let us look at a few scheduling algorithms.

#### **FIFO Scheduler**

A FIFO scheduler maintains a queue of threads waiting to run. When a new request arrives, it is enqueued, unless there is an idle processor where the thread can begin execution immediately. When a thread finishes and its core becomes available, the next thread from the queue is given the available core. Threads always run to completion.

As an example, schedule 1 from above is produced by a FIFO scheduler. You can find a FIFO scheduler simulator in the accompanying FifoScheduler.java.

#### Round Robin Scheduler\*

Make it non-optional?

A round robin scheduler is similar to a FIFO scheduler. The main difference is that threads do not run to completion. Instead they run for just one time step, and then are moved back in the queue.

The accompanying RoundRobingScheduler.java contains a simulator. Let us look at its most important parts. The simulator reads in a list of requests like the following:

2 1 A 3

- 1 B 2
- 2 C 4
- 3 D 1
- 6 E 1

This corresponds to our previous example. The first line gives the number of available cores. The second line says that, at time 1, thread A is created, and thread A will finish after it will run for 3 time steps. The third and following lines have the same format as the second line. The number of cores is stored in integer n; the rest is stored in a Deque(Task) called input. The fact that we parse all the input before doing any work and the particular type of input are implementation details.

The important data structures of the simulator are

- Deque<Task> active = new ArrayDeque<>();
- 2 Deque<Task> running = new ArrayDeque<>();

In the queue active we hold those threads that were created but did not finish. In running we hold those threads that are currently running. The exact type of running is an implementation detail; however, it is important that active has a queue data type. (In other words, it should be straightforward to change the type of running to an array, but you'd run into more trouble if you'd change the type of active to an array. Try it!)

The main loop has the following structure:

```
int time = 0;
while (!running.isEmpty() || !active.isEmpty() || !input.isEmpty()) {
    // <Simulate one step>
    ++time;
    }
```

We simulate one step as follows:

```
    // <Handle requests to create threads>
    // <Put threads back in the queue after they run one step>
```

TODO: for litprog: say whic chunk I define

<sup>3 // &</sup>lt;Schedule work for the next time step>

Let's start with the last part. To schedule work for the next time step, we simply move at most n threads from active to running:

```
1 for (int i = 0; i < n && !active.isEmpty(); ++i)
2 running.addLast(active.removeFirst());</pre>
```

After one time step, when we put threads back in the queue **active**, we also check whether threads terminated.

```
while (!running.isEmpty()) {
   Task t = running.removeFirst();
   if (--t.duration > 0) active.addLast(t);
  }
```

Finally, to handle requests to create threads, we move threads that start at the current time from input to active.

```
while (true) {
   Task t = input.peekFirst();
   if (t == null || t.startTime > time) break;
   input.removeFirst();
   active.addLast(t);
  }
```

The loop above assumes that input contains threads ordered by their  $\ensuremath{\mathsf{startTime}}$  .

If we run  ${\sf RoundRobinScheduler}$  on the example input from above, we get

@1 A:1 B:2
@2 C:1 A:2
@3 B:1 D:2
@4 C:1 A:2
@5 C:1
@6 E:1 C:2

The first line says that at time 1 (@1) thread A runs on core 1 (A:1) and thread B runs on core 2 (B:1). We can see that thread A finished at time 5, with a delay of 1. The total delay of this schedule is 1 + 1 + 1 + 0 + 0 = 3.

#### **Completely Fair Scheduler**\*

In this section we look at the scheduler used by Linux<sup>3</sup>, which is called *CFS* (completely fair scheduler). CFS approximates an ideal round robin scheduler whose time unit tends to 0. Let's see what happens if we use a round robin with a very small, albeit not 0, time unit. We'll use our running example. If we make the time unit  $10^6$  times smaller than it used to be, then all the times in the input get multiplied by  $10^6$ :

```
2
1000000 A 300000
1000000 B 200000
2000000 C 4000000
3000000 D 1000000
6000000 E 1000000
```

If we run our scheduler on this file, we see that the finish times for threads A, B, C, D and E are, respectively

5000000	3666667	7000000	4666666	7000000
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or, in terms of the initial units, approximatively

```
5 3\frac{2}{3} 7 4\frac{2}{3} 7
```

```
<sup>3</sup>version 4.2
```

for a total delay of  $1 + \frac{2}{3} + 1 + \frac{2}{3} + 0 = 3\frac{1}{3}$ . We could reason about the limiting case directly: If *n* threads run on *k* cores for a time interval *dt*, then each thread gets to run for  $\min\{dt, \frac{k \cdot dt}{n}\}$  time. We say that each thread runs at the *speed*  $\min\{1, \frac{k}{n}\}$ . In our example, we have

From	То	Duration	Running	Speed	Runtime
1	2	1	AB	1	1
2	3	1	ABC	2/3	2/3
3	11/3	2/3	ABCD	1/2	1/3
11/3	14/3	1	ACD	2/3	2/3
14/3	5	1/3	AC	1	1/3
5	6	1	С	1	1
6	7	1	CE	1	1

Threads running in parallel have the same speed. The speed changes when a running thread terminates or a new thread is created.

CFS changes the set of running threads only at integer times, but it tries nevertheless to imitate a schedule like the one above. To do so, it associates with each thread a virtual time variable. Intuitively, this variable tracks how much of the ideal schedule a particular thread executed. For example, at time 11/3 in the ideal schedule from above, thread A executed for 1 + 2/3 + 1/3 = 2 time units; hence, after executing for 2 time units, thread *A* has virtual time  $\approx 11/3$ . The virtual time only approximates 11/3 because tracking the exact value would be too expensive in terms of computing time. CFS handles our running examples as follows:

				Virtual time				
Time	Action	Active	Speed	А	В	С	D	Е
1	create AB	AB	1	1	1			
	run AB	AB	1	2	2			
2	create C	ABC	2/3	2	2	2		
	run AB	ABC	2/3	7/2	7/2	2		
	done B	AC	1	7/2		2		
3	create D	ACD	2/3	7/2		2	3	
	run CD	ACD	2/3	7/2		7/2	9/2	
	done D	AC	1	7/2		7/2		
4	run AC	AC	1	9/2		9/2		
	done A	С	1			9/2		
5	run C	С	1			11/2		
6	create E	CE	1			11/2		6
	run CE	CE	1			13/2		7
	done CE							

Whenever a thread is created, its virtual time is set to equal the real time. At each time step, at most 2 threads run, because we have two available cores. *CFS always chooses to run those threads with smallest virtual times.* Thread speed is defined as before, with respect to the number of active threads. (In the ideal scenario, there is no distinction between running and active threads.) Whenever a thread runs for one time unit, the inverse of the speed is added to the virtual time of the thread.

Note that, after thread A runs for 2 time steps, its virtual time is 7/2 which is fairly close to 11/3: the error is 1/6. What causes this error? The computation done by CFS — simply adding the inverse of the speed — does not take into account the creation of thread D at time 3. That creation slows down thread A in the ideal schedule, from speed 2/3 to speed 1/3. But, CFS adds 3/2 to the virtual time, as if the second time step of A is all spent at speed 2/3. CFS *could* do an exact computation in this case, but that would be complicated, expensive, and without a big benefit in practice.

The accompanying CompletelyFairScheduler.java contains a simulator. The main difference from the round robin scheduler is that the queue is replaced by a priority queue, which is sorted by the virtual time.

# **Scheduler Tuning**

The model we used so far is simplified. In reality, for example, (a) cores do not change threads in sync, all at the same time, and (b) threads sometimes *yield*, meaning that they ask to wait. Nevertheless, the model was expressive enough to illustrate several important concepts, such as delay and response time. Other aspects, such as context switches (changing which thread runs on a core), thread migration (moving a thread from one core to another), and data locality (whether threads acting on the same data run on the same core), are not salient in our model. Still, these other aspects are important in practice.

One strategy to improve the efficiency of a program is to keep together the threads that act on the same data. To do so, we use code like

- 1 cpu\_set\_t cpu\_mask;
- 2 CPU\_ZERO(&cpu\_mask);

```
3 CPU_SET(0, &cpu_mask); CPU_SET(3, &cpu_mask); CPU_SET(4, &cpu_mask);
```

```
4 sched_setaffinity(0, sizeof(cpu_set_t), &cpu_mask);
```

After this, the current thread will only be allowed to run on cores 0, 3 and 4. In general, the *affinity* of a thread is a set of processing units on which it is allowed to run.

The accompanying program affinity.c uses sched\_setaffinity to illustrate the effect of data locality.

### **Exercises**

- 1. ► What is a FIFO scheduler?
- 2. What is a round-robin scheduler?
- 3. ► Two periodic tasks are run on a single processor. The first task has a period of 100 ms and a duration of 10 ms. The second task has a period of 200 ms and a duration of 40 ms. What is the CPU utilisation? What would happen if the CPU utilisation would be > 1?
- 4. Look at FifoScheduler.java and RoundRobinScheduler.java side by side. Describe the differences. [Hint: There exist several tools for comparing text files, suc as vimdiff.] Same for RoundRobinScheduler.java and CompletelyFairScheduler.java.
- 5. The virtual times computed by a completely fair scheduler approximate the real times of an ideal scheduler. Can you change the completely fair scheduler so that it tracks the times of an ideal scheduler *exactly*?
- 6. ► What is processor affinity?
- 7. Look at 'man sched\_setscheduler' to see which schedulers are available in Linux, and how to choose them.

## References

[1] Linux kernel 4.2.0, Documentation/scheduler/sched-design-CFS.txt