

Luo Chen (001564677)

# Program Structures & Algorithms

Fall 2021

## Assignment No. 5

### Task

- Implement a parallel sorting algorithm such that each partition of the array is sorted in parallel.
- Consider two different schemes for deciding whether to sort in parallel.

### Conclusion:

- Array size doesn't matter if it's already large enough.*
- When cutoff = 50000, the algorithm performs better.
- On 4 cores and 8 cores machine with enough memory, the best parallelism is 8 for most cases. When array size is much larger than cutoff (like 1000 times), the best parallelism can be 16 or even larger. When array size / cutoff < 1000, the best parallelism can be the core number of cpu or even less.

### Output (Snapshot of Code output in the terminal)

```
[INFO] --- exec-maven-plugin:3.0.0:java (default-cli) @ INF06205 ---
2021-11-10 03:59:45 INFO Main - Start to sort array with cutoff = 4096, arraySize = 262144, parallelism = 3
2021-11-10 03:59:45 INFO Benchmark_Timer - Begin run: InsertSortBenchmarkReversed with 10 runs
2021-11-10 03:59:45 INFO Main - Complete sorting in mean time 32.500000ms with cutoff = 4096, arraySize = 262144, parallelism = 3
2021-11-10 03:59:45 INFO Main - Start to sort array with cutoff = 8192, arraySize = 262144, parallelism = 3
2021-11-10 03:59:45 INFO Benchmark_Timer - Begin run: InsertSortBenchmarkReversed with 10 runs
2021-11-10 03:59:46 INFO Main - Complete sorting in mean time 19.700000ms with cutoff = 8192, arraySize = 262144, parallelism = 3
2021-11-10 03:59:46 INFO Main - Start to sort array with cutoff = 4096, arraySize = 262144, parallelism = 6
2021-11-10 03:59:46 INFO Benchmark_Timer - Begin run: InsertSortBenchmarkReversed with 10 runs
2021-11-10 03:59:46 INFO Main - Complete sorting in mean time 22.200000ms with cutoff = 4096, arraySize = 262144, parallelism = 6
2021-11-10 03:59:46 INFO Main - Start to sort array with cutoff = 8192, arraySize = 262144, parallelism = 6
2021-11-10 03:59:46 INFO Benchmark_Timer - Begin run: InsertSortBenchmarkReversed with 10 runs
2021-11-10 03:59:46 INFO Main - Complete sorting in mean time 19.100000ms with cutoff = 8192, arraySize = 262144, parallelism = 6
Succed to output data to ./result2021-11-10T03:59:46.778846.csv
```

## ◉ **Report**

### ○ **Experiments**

The experiments run on the AWS EC2 instances, Amazon Linux 2 AMI.

Type: t2.2xlarge

vCPUs: 8 (core == processor == 8)

Memory: 32G (sufficient enough)

Type: t2.xlarge

vCPUs: 4 (core == processor == 4)

Memory: 16G (sufficient enough, unable to choose custom memory)

### ○ **Variable Matrix**

array size [ $2^{18}$ ,  $2^{19}$ ,  $2^{20}$ ,  $2^{21}$ ,  $2^{22}$ ,  $2^{23}$ ,  $2^{24}$ ,  $2^{25}$ ], from 262144 to 33554432

cutoff [ $2^{12}$ ,  $2^{13}$ ,  $2^{14}$ ,  $2^{15}$ ,  $2^{16}$ ,  $2^{17}$ ,  $2^{18}$ ,  $2^{19}$ ], from 4096 to 524288

parallelism [1, 2, 4, 8, 16]

Experiments have been done with each combination of the three variables and on 2 different instances for 10 time for each.

### ○ **Data Results**

For vCPUs 8, see result\_8core.csv

For vCPUs 4, see result\_4core.csv

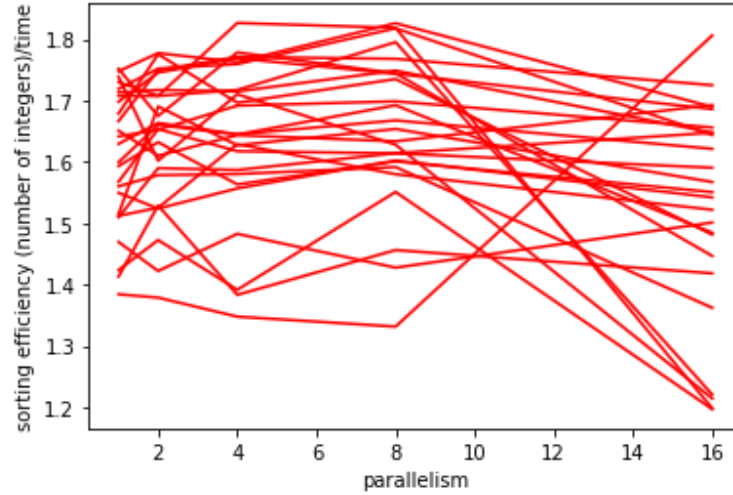
### ○ **Analysis**

#### ▪ **Parallelism**

Compare the situations in two type of instances.

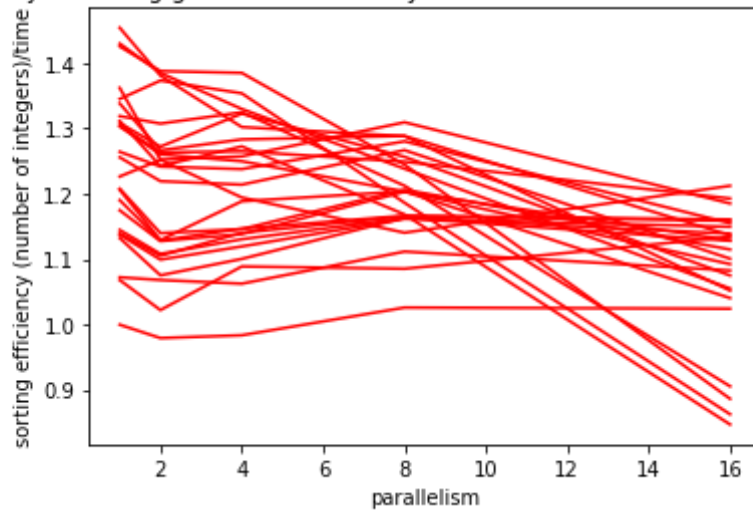
For 8 cores

The efficiency of sorting given different array size( $2^{21} \sim 2^{25}$ ) and cufoff( $2^{14} \sim 2^{18}$ )



For 4 cores

The efficiency of sorting given different array size( $2^{21} \sim 2^{25}$ ) and cufoff( $2^{14} \sim 2^{18}$ )



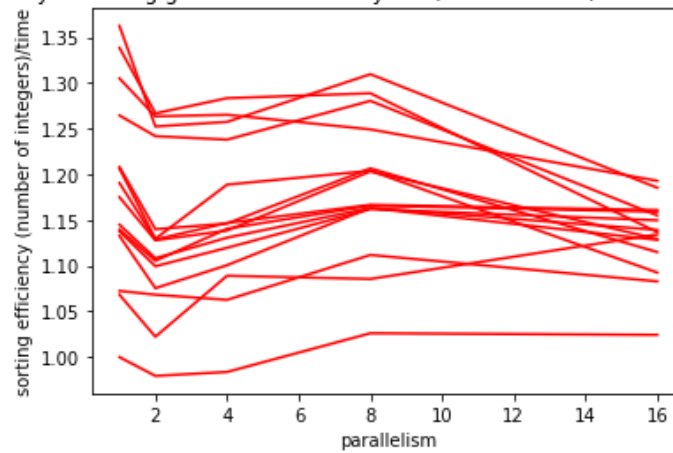
The x axis represents for # of parallelism, the y axis represents for sort efficiency(array size / time). Each line represents one combination of size and cutoff.

From data from the instance with 8 cores, we can barely figure out that we have the best performance when parallelism equals to 8. It is understandable that this is a computation-ally intensive task, so that we can achieve the best efficiency when parallelism is nearly equals to the number of cpu cores given that we have enough memory.

For 4 cores, the best parallelism can be chosen between 8 and 4. It is hard to decide which one is better. In further, we choose different size to do comparison. We don't consider it when parallelism equals to 1 because it would become a single thread method.

When we select size in [33554432, 16777216, 8388608] and cutoff in [262144, 131072, 65536, 32768, 16384].

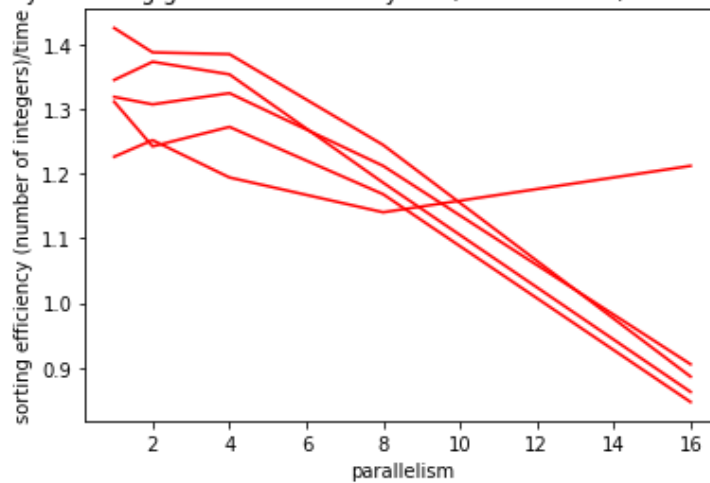
The efficiency of sorting given different array size( $2^{21} \sim 2^{25}$ ) and cutoff( $2^{14} \sim 2^{18}$ )



We can tell that it performs better when parallelism = 8.

When we select size in  $[4194304, 2097152]$  and cutoff in  $[262144, 131072, 65536, 32768, 16384]$ .

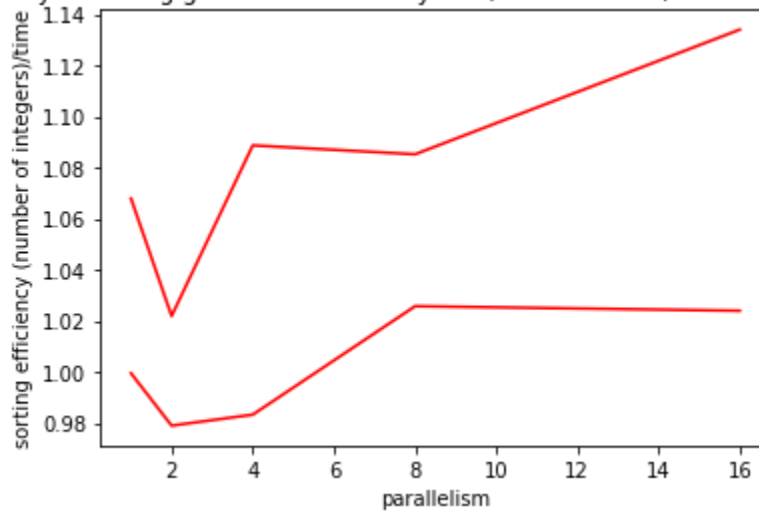
The efficiency of sorting given different array size( $2^{21} \sim 2^{25}$ ) and cutoff( $2^{14} \sim 2^{18}$ )



We can tell that it performs better when parallelism is smaller, when equals to 4 and 2.

When we select a large size  $[33554432]$  and a small cutoff in  $[32768, 16384]$ .

The efficiency of sorting given different array size( $2^{21} \sim 2^{25}$ ) and cutoff( $2^{14} \sim 2^{18}$ )



Seems that we can achieve a better performance when parallelism equals to 16 or even larger! For my understanding, it turns out to be a I/O intensive task so that it works better with more threads.

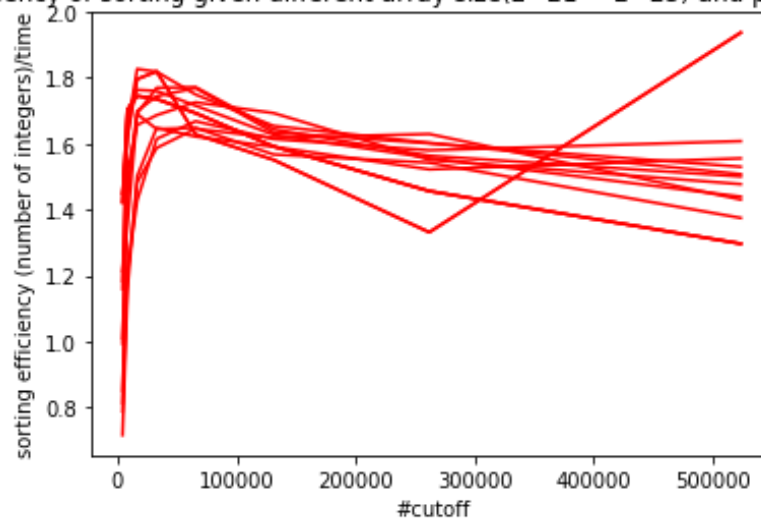
Conclusion for parallelism

In my experiments and given the array size and cutoff, parallelism = 8 might be a good choice for sorting both on the instances with 4 and 8 cores. And when the size of array is much larger than the cutoff, it performs better when we choose larger parallelism even when we don't have enough cores.

## ▪ Cutoff

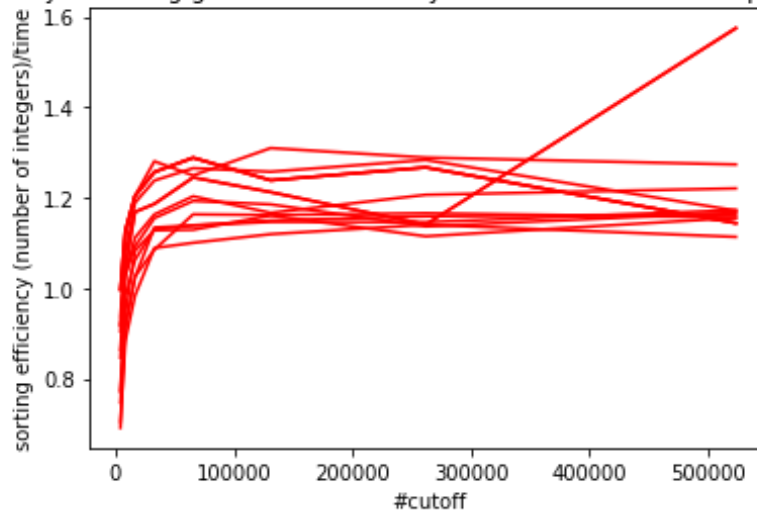
8 cores

The efficiency of sorting given different array size( $2^{21} \sim 2^{25}$ ) and parallelism(4~16)



4 cores

The efficiency of sorting given different array size( $2^{21} \sim 2^{25}$ ) and parallelism(4~16)



The x axis represents for cutoff, the y axis represents for sort efficiency(array size / time). Each line represents one combination of size and parallelism.

It's clear in the first picture for 8 cores that the performance is the best when cutoff is about 50000. Seems that the best cutoff doesn't change with the growth of array size. And for the result of 4 cores cpu, the efficiency is almost the same and cutoff = 50000 won with a small advantage.

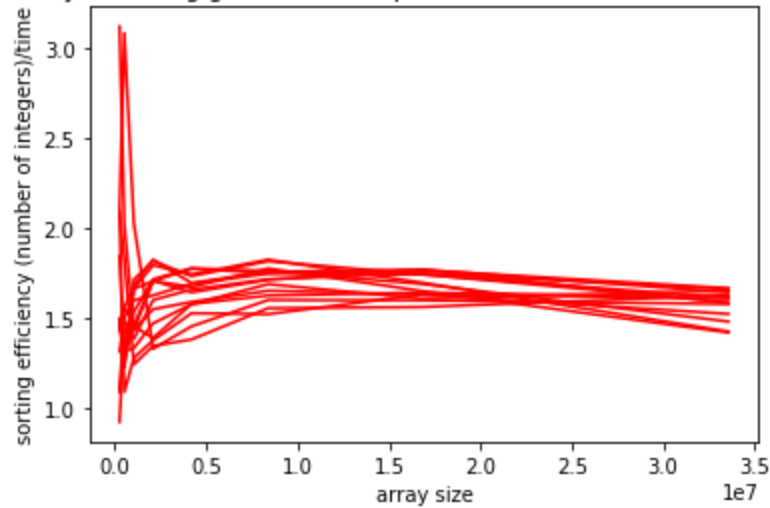
Conclusion for cutoff

The best cutoff in my experiments is about 50000. And the best value will not increase with the growth of array size.

## ▪ Array size

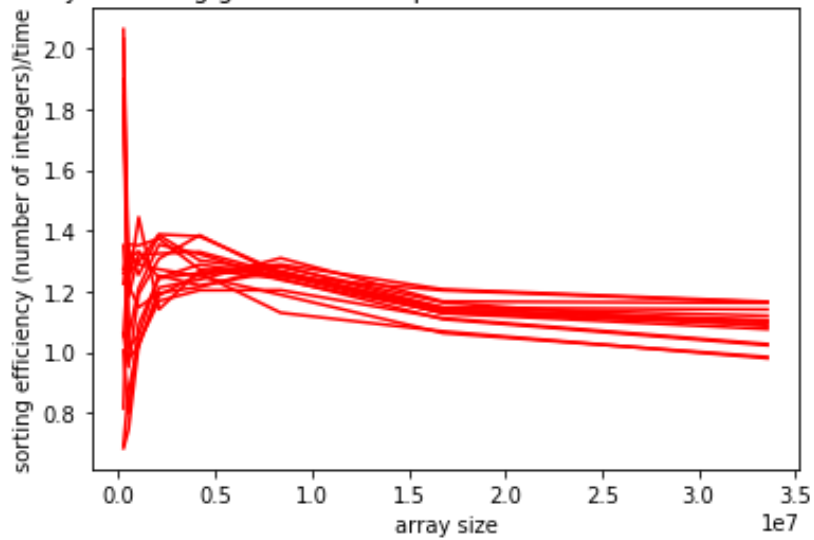
8 cores

The efficiency of sorting given different parallelism(2, 4, 8) and cutoff( $2^{14} \sim 2^{18}$ )



4 cores

The efficiency of sorting given different parallelism(2, 4, 8) and cutoff( $2^{14} \sim 2^{18}$ )



The x axis represents for array size, the y axis represents for sort efficiency(array size / time). Each line represents one combination of cutoff and parallelism.

There is no big change when array size is greater than  $5 * 10^7$ . We can see a slight decrease after that. It is acceptable that more time will be spent on creating new threads and copying numbers between arrays during parallel merge sorting, which will influence the efficiency of processing each number. It is also worth mentioning that we got a very high value when  $x$  is closed to 0. When the size of array is not large enough, we can directly sort an array using `Arrays.sort()` rather than parallel merge sort. That's why we got high efficiency when size is very large.

Conclusion for array size.

The size doesn't matter when it's big enough.