## Parallel Algorithms Assignment #1

Participants:

Florian Groguelin Bashar Qamhiyeh

## 1 - OpenMP Scheduling (Matrix Vector Product)

## 1 - Static Scheduling

**#pragma omp parallel for schedule(static), private(j, r)** to the outer loop of the sequential part.

## 2 - Dynamic Scheduling

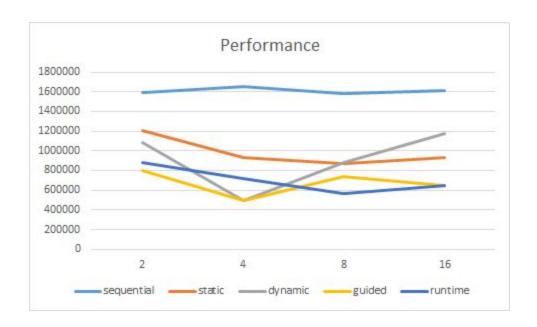
Same as the static scheduling but replace **static** key work with **dynamic** 

## 3 - Guided Scheduling

Same as the static scheduling but replace **static** key work with **guided** 

4 -

| #threads   | 2       | 4       | 8       | 16      |
|------------|---------|---------|---------|---------|
| Sequential | 1594793 | 1654391 | 1585065 | 1615392 |
| static     | 1202986 | 932689  | 870522  | 930166  |
| dynamic    | 1081271 | 499519  | 880466  | 1175633 |
| guided     | 803904  | 491440  | 737401  | 645403  |
| runtime    | 882134  | 716814  | 566884  | 645123  |



**5** - We ran the process on a computer with 4 physical processors. The performance with parallelism is better in all cases. When the number of threads getting more than the number of physical cores the performance decreases. And the best performance on average for all scheduling algorithms is the best when number of threads equals 4

### D - Runtime Scheduling

We added **chunk\_size** and changed the scheduling algorithm to **runtime**. The table shows the result for different chunk sizes with 5 tries for each

| chunk_size | 2       | 4       | 8       | 16      | 64      | 256     |
|------------|---------|---------|---------|---------|---------|---------|
| Exp1       | 2834454 | 2146083 | 1621461 | 1594858 | 2207638 | 1611446 |
| Exp2       | 2213377 | 2414760 | 2406962 | 2501857 | 2518778 | 1583729 |
| Exp3       | 2659782 | 1871556 | 1961748 | 2213970 | 1814997 | 2535164 |
| Exp4       | 2524973 | 1613722 | 2628038 | 1915199 | 1643488 | 1824536 |
| Exp5       | 2446594 | 2432964 | 1607263 | 1607923 | 1591477 | 1637239 |
| Average    | 2535836 | 2095817 | 2045094 | 1966761 | 1955275 | 1838422 |

We notice that the performance is better for larger chunk size we benefit from the cache locality.

#### 2 - Bubble sort:

For the Bubble we used **Dynamic** scheduling. The array was divided to number of chunks. The chunk size is (size / number\_of\_threads). Each thread sorts a chunk of the array to benefit from cache locality.

We also defined a limit for the chunk size. If the chunk size exceed the limit we do not calculate chunk size as (size / number\_of\_threads) but it becomes the limit and we have more chunks. The idea behind the limit is to fit the hole chunk in the cache.

#### Performance:

| N  | sequential | Parallel (dynamic) |
|----|------------|--------------------|
| 4  | 2395       | 86425              |
| 8  | 173289     | 1464546            |
| 12 | 27753994   | 29460708           |
| 16 | 4084165190 | 7428302253         |

We notice form the table that small array size the performance is better for the sequential algorithm. That's because time used to divide the task between thread is more than the time needed to perform the sort. But for the large numbers the performance for parallelism was better.

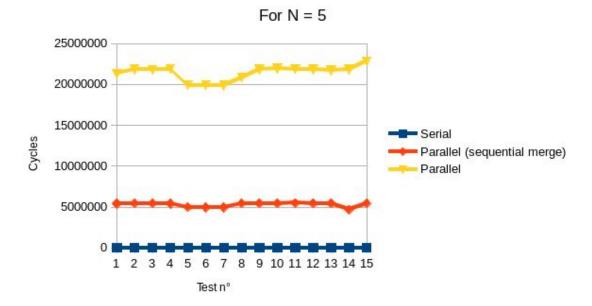
## 3 - Quicksort:

For the parallel quicksort, we divide the array in some chunks and each thread applies the sequential quicksort to these chunks. After that, the threads merge the chunks two by two and we repeat the merge part until the array is sorted.

- Number of cycles for 2<sup>5</sup> elements:

Average

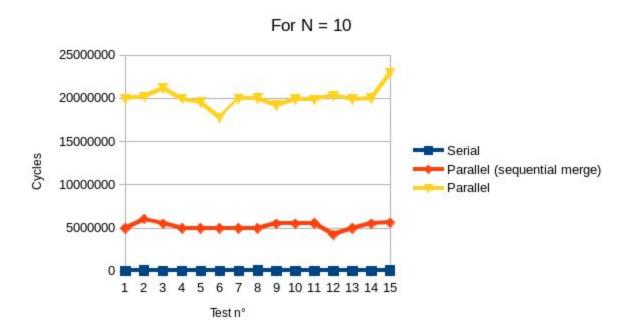
| Serial | Parallel<br>(sequential<br>merge) | Parallel |
|--------|-----------------------------------|----------|
| 1485   | 5432975                           | 21330000 |
| 1161   | 5457148                           | 21840568 |
| 1258   | 5448105                           | 21781465 |
| 1265   | 5385370                           | 21889211 |
| 1440   | 4977389                           | 19903615 |
| 1260   | 4960590                           | 19920509 |
| 1080   | 4949875                           | 19882381 |
| 1478   | 5449328                           | 20821531 |
| 1275   | 5451337                           | 21813005 |
| 1261   | 5453617                           | 21929124 |
| 1263   | 5485828                           | 21873900 |
| 1249   | 5444729                           | 21826073 |
| 1273   | 5435432                           | 21709947 |
| 1273   | 4690431                           | 21852873 |
| 1273   | 5455832                           | 22824417 |
| 1286   | 5298532                           | 21413241 |



## - Number of cycles for 2<sup>10</sup> elements:

| Serial | Parallel<br>(sequential<br>merge) | Parallel |
|--------|-----------------------------------|----------|
| 55664  | 4935742                           | 19940212 |
| 67031  | 6025807                           | 20164678 |
| 55710  | 5491705                           | 21164855 |
| 54912  | 4942941                           | 19920282 |
| 55708  | 4943070                           | 19540707 |
| 55750  | 4939340                           | 17742099 |
| 48920  | 4942941                           | 19948334 |
| 64821  | 4950102                           | 20006514 |
| 55438  | 5483497                           | 19189367 |
| 48078  | 5473143                           | 19868739 |
| 56139  | 5507384                           | 19835801 |
| 55706  | 4222978                           | 20290491 |
| 56131  | 4954609                           | 19882678 |

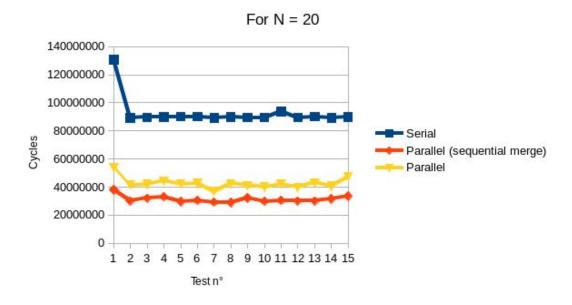
|         | 48460 | 5483093 | 19986230 |
|---------|-------|---------|----------|
|         | 66818 | 5594881 | 22930680 |
|         |       |         |          |
| Average | 56352 | 5192748 | 20027444 |



# - Number of cycles for 2<sup>20</sup> elements:

| Serial    | Parallel<br>(sequential<br>merge) | Parallel |
|-----------|-----------------------------------|----------|
| 130841733 | 38157537                          | 54084267 |
| 89387033  | 30029348                          | 41581166 |
| 89739323  | 31959875                          | 42098444 |
| 89836666  | 33102614                          | 44336236 |
| 90031535  | 29713399                          | 42212276 |
| 90128051  | 30449265                          | 42684118 |
| 89363595  | 29221579                          | 37072877 |
| 89906027  | 28960823                          | 42299346 |

|         | 89416780 | 32229823 | 41003242 |
|---------|----------|----------|----------|
|         | 89529092 | 29901942 | 39955974 |
|         | 93864696 | 30547820 | 42236517 |
|         | 89539239 | 30097432 | 39729478 |
|         | 90040372 | 30011090 | 43007994 |
|         | 89226375 | 31551732 | 40666891 |
|         | 89876612 | 33583576 | 47386507 |
|         |          |          |          |
| Average | 92715141 | 31301190 | 42690355 |



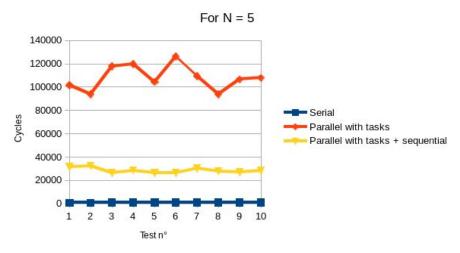
As the graphs show, the serial quicksort is really efficient when the array to sort is composed of few elements. More the number of elements increases, more the parallel sort is better. For the third example, the parallel sort with the sequential merge has less cycles the full parallel one but if the length of array increases a lot the full parallel sort will be the fastest.

## 4 - Merge sort:

To program the merge sort we implemented it recursively, indeed as we divide by two the array at each step and we merge the two chunks at the end so a recursive version is natural. For our third version, we mixed the parallel merge sort with taks and the sequential sort.

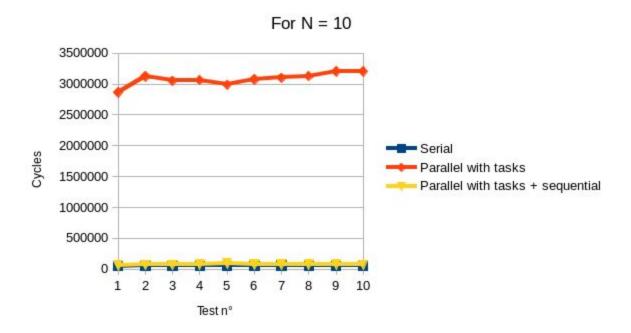
- Number of cycles for 2<sup>5</sup> elements:

|         | Serial | Parallel with tasks | Parallel with tasks<br>+ sequential |
|---------|--------|---------------------|-------------------------------------|
|         | 949    | 101537              | 31468                               |
|         | 951    | 93841               | 32529                               |
|         | 1040   | 117734              | 26419                               |
|         | 1041   | 119648              | 28658                               |
|         | 1039   | 104446              | 26554                               |
|         | 1040   | 126038              | 26445                               |
|         | 1040   | 109333              | 30281                               |
|         | 1041   | 93892               | 27859                               |
|         | 1041   | 106465              | 26924                               |
|         | 1041   | 107820              | 28496                               |
|         |        |                     |                                     |
| Average | 1022   | 108075              | 28563                               |



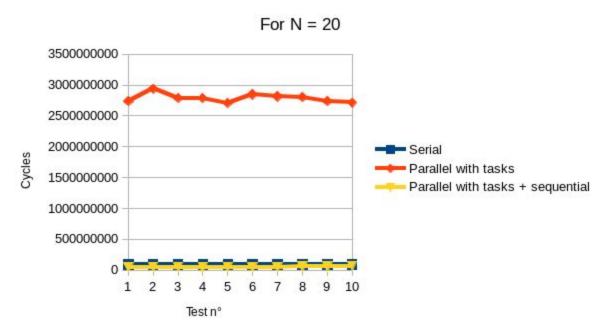
- Number of cycles for 2<sup>10</sup> elements:

|         | Serial | Parallel with tasks | Parallel with tasks<br>+ sequential |
|---------|--------|---------------------|-------------------------------------|
|         | 48684  | 2863218             | 64189                               |
|         | 53514  | 3125362             | 70422                               |
|         | 53552  | 3051064             | 69229                               |
|         | 53548  | 3062470             | 75040                               |
|         | 53604  | 2986329             | 94103                               |
|         | 53542  | 3074940             | 76907                               |
|         | 63105  | 3101710             | 77826                               |
|         | 53518  | 3129290             | 77437                               |
|         | 53642  | 3205394             | 76133                               |
|         | 59300  | 3200039             | 70638                               |
|         |        |                     |                                     |
| Average | 54600  | 3079981             | 75192                               |



- Number of cycles for 2<sup>20</sup> elements:

|         | Serial   | Parallel with tasks | Parallel with tasks<br>+ sequential |
|---------|----------|---------------------|-------------------------------------|
|         | 96409937 | 2736978380          | 48824492                            |
|         | 96389320 | 2939137681          | 51067256                            |
|         | 96387957 | 2788734349          | 51717559                            |
|         | 96291823 | 2786573007          | 45632706                            |
|         | 96546840 | 2708624587          | 50841000                            |
|         | 96651588 | 2848650133          | 51829156                            |
|         | 96320032 | 2814401475          | 52211453                            |
|         | 96318352 | 2801972154          | 60461356                            |
|         | 96275273 | 2739469031          | 57881420                            |
|         | 96513894 | 2711664606          | 68035648                            |
|         |          |                     |                                     |
| Average | 96410501 | 2787620540          | 53850204                            |



Such as the quicksort, the sequential version is really fast when the array is not big. Nevertheless the parallel version is very slow and more the length of the array is high more the number of cycles increases. That can be explained by number of tasks, in

the parallel version the number of tasks is  $2log^2(N)$ . However, the third version is almost twice faster than the sequential merge sort for huge array.