Comparing Parallel and Distributed Programming Models: Coursework Stage 2

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Section 1 Comparative Sequential Performance

| Data Set | Go Runtimes (s) | C Runtimes (s) | Erlang Runtimes (s) |
|----------|-----------------|----------------|---------------------|
| DS1 | 15.91639141 | 15.21514 | 27.560312 |
| DS2 | 67.95405428 | 65.28168 | 118.87842 |

Figure 1.1: Comparing C, Go and Erlang Sequential Runtimes

The difference in sequential runtimes are almost negligible, however C does consistently achieve a runtime of 500-2500ms faster than Go. This is likely because of Go's garbage collector (explained in further detail in section 2.4). Erlang on the other hand is much slower than Go or C, which suggests this problem cannot be done efficiently by a functional language. CPU bound problems are also likely slower in Erlang, and the typical solution is to push the problem to another language. Erlang is also designed for reliability and communications, and not tuned for performance (it prioritises low latency over high throughput, which is the opposite for Go and C).

Section 2 Two Worker Totient Range Erlang Problem: totientrange2Workers

| Ranges | Runtime (s) |
|------------|-------------|
| (1, 4000) | 1.386345 |
| (1, 15000) | 21.413966 |

Figure 1.2: Erlang runtime

Input: {1, 4000}

1> c(totientrange2Workers).

{ok,totientrange2Workers}

2> totientrange2Workers:startServer().

true

3> server ! {range, 1, 4000}.

Worker: computing range 1 to 2000 Worker: computing range 2001 to 4000

{range,1,4000}

Server: Received Sum: 1216588 Server: Received Sum: 3647014 Server: Sum of totients: 4863602

Time taken in Secs, MicroSecs 1 386345

Worker: finished Worker: finished

4>

Input: {1, 15000}

1> c(totientrange2Workers).

{ok,totientrange2Workers}

2> totientrange2Workers:startServer().

true

3> server ! {range, 1, 15000}.

Worker: computing range 1 to 7500 Worker: computing range 7501 to 15000

{range,1,15000}

Server: Received Sum: 17099412 Server: Received Sum: 51294904 Server: Sum of totients: 68394316

Time taken in Secs, MicroSecs 21 413966

Worker: finished Worker: finished

Section 3 Multi Worker Erlang Totient Range Problem: totientrangeNWorkers

| Ranges + Number of Workers | Runtime (s) |
|----------------------------|-------------|
| (1, 4000, 4) | 0. 864819 |
| (1, 15000, 6) | 9.259248 |

Input: {1, 4000, 4}

1> c(totientrangeNWorkers).

{ok,totientrangeNWorkers}

2> totientrangeNWorkers:startServer().

true

3> server! {range, 1, 4000, 4}.

Worker: started Worker: started Worker: started Worker: started {range,1,4000,4}

Worker: computing range 1 to 1000 Worker: computing range 1001 to 2000 Worker: computing range 2001 to 3000 Worker: computing range 3001 to 4000

Server: Received Sum: 304192

Worker: finished

Server: Received Sum: 912396

Worker: finished

Server: Received Sum: 1519600

Worker: finished

Server: Received Sum: 2127414 Server: Sum of totients: 4863602

Time taken in Secs, MicroSecs 0 864819

Worker: finished

Input: {1, 15000, 6}

1> c(totientrangeNWorkers). {ok,totientrangeNWorkers}

2> totientrangeNWorkers:startServer().

true

3> server! {range, 1, 15000, 6}.

Worker: started Worker: started Worker: started Worker: started Worker: started Worker: started {range,1,15000,6}

Worker: computing range 1 to 2500
Worker: computing range 2501 to 5000
Worker: computing range 5001 to 7500
Worker: computing range 7501 to 10000
Worker: computing range 10001 to 12500
Worker: computing range 12501 to 15000

Server: Received Sum: 1899878

Worker: finished

Server: Received Sum: 5700580

Worker: finished

Server: Received Sum: 9498954

Worker: finished

Server: Received Sum: 13298074

Worker: finished

Server: Received Sum: 17100872

Worker: finished

Server: Received Sum: 20895958 Server: Sum of totients: 68394316

Worker: finished

Time taken in Secs, MicroSecs 9 259248

Section 4 Reliable Multi Worker Erlang Totient Range Erlang Problem: totientrangeNWorkersReliable

| Number of Workers + Number of Victims | Runtime (s) |
|---------------------------------------|-------------|
| (4, 3) | 14.367165 |
| (8, 6) | 9.82087 |
| (12, 10) | 6.610769 |

Input: {4, 3}

1> c(totientrangeNWorkersReliable).

{ok,totientrangeNWorkersReliable}

2> totientrangeNWorkersReliable:testRobust(4,3).

Watcher: Watching Worker worker1
Watcher: Watching Worker worker2
Watcher: Watching Worker worker3
Watcher: Watching Worker worker4
Worker: computing range 1 to 3750
Worker: computing range 3751 to 7500
Worker: computing range 7501 to 11250
Worker: computing range 11251 to 15000

workerChaos killing worker3

Watcher: Watching Worker worker3 Worker: computing range 7501 to 11250

workerChaos killing worker3

Watcher: Watching Worker worker3 Worker: computing range 7501 to 11250

workerChaos killing worker4

Watcher: Watching Worker worker4
Worker: computing range 11251 to 15000

[true,true,true]

Server: Received Sum: 4275174 Server: Received Sum: 12824238 Server: Received Sum: 21371600 Server: Received Sum: 29923304 Server: Sum of totients: 68394316

Time taken in Secs, MicroSecs 14 367165

Input: {8, 6}

1> c(totientrangeNWorkersReliable).

{ok,totientrangeNWorkersReliable}

2> totientrangeNWorkersReliable:testRobust(8,6).

Watcher: Watching Worker worker1 Watcher: Watching Worker worker2 Watcher: Watching Worker worker3

Watcher: Watching Worker worker4 Watcher: Watching Worker worker5 Watcher: Watching Worker worker6

Watcher: Watching Worker worker7
Watcher: Watching Worker worker8
Worker: computing range 1 to 1875
Worker: computing range 1876 to 3750

Worker: computing range 3751 to 5625 Worker: computing range 5626 to 7500 Worker: computing range 7501 to 9375

Worker: computing range 9376 to 11250 Worker: computing range 11251 to 13125 Worker: computing range 13126 to 15000

Server: Received Sum: 1069230 workerChaos killing worker4

Watcher: Watching Worker worker4 Worker: computing range 5626 to 7500

workerChaos killing worker5

Watcher: Watching Worker worker5 Worker: computing range 7501 to 9375

Server: Received Sum: 3205944 workerChaos killing worker4

Watcher: Watching Worker worker4 Worker: computing range 5626 to 7500

workerChaos killing worker5

Watcher: Watching Worker worker5 Worker: computing range 7501 to 9375

Server: Received Sum: 5343712 workerChaos killing worker3

workerChaos already dead: worker3

workerChaos killing worker7

Watcher: Watching Worker worker7 Worker: computing range 11251 to 13125

[true,true,true,true,ok,true] Server: Received Sum: 7480526 Server: Received Sum: 11754000 Server: Received Sum: 9617600 Server: Received Sum: 16029232 Server: Received Sum: 13894072 Server: Sum of totients: 68394316

Input: {12, 10}

1> c(totientrangeNWorkersReliable).

{ok,totientrangeNWorkersReliable}

2> totientrangeNWorkersReliable:testRobust(12,10).

Watcher: Watching Worker worker1
Watcher: Watching Worker worker2
Watcher: Watching Worker worker3
Watcher: Watching Worker worker4
Watcher: Watching Worker worker5

Watcher: Watching Worker worker6 Watcher: Watching Worker worker7 Watcher: Watching Worker worker8

Watcher: Watching Worker worker9 Watcher: Watching Worker worker10 Watcher: Watching Worker worker11 Watcher: Watching Worker worker12

Worker: computing range 1 to 1250 Worker: computing range 1251 to 2500

Worker: computing range 2501 to 3750 Worker: computing range 3751 to 5000 Worker: computing range 5001 to 6250

Worker: computing range 6251 to 7500
Worker: computing range 7501 to 8750
Worker: computing range 8751 to 10000

Worker: computing range 10001 to 11250 Worker: computing range 11251 to 12500 Worker: computing range 12501 to 13750

Worker: computing range 13751 to 15000

Server: Received Sum: 475306 workerChaos killing worker12

Watcher: Watching Worker worker12 Worker: computing range 13751 to 15000

Server: Received Sum: 1424572 workerChaos killing worker5

Watcher: Watching Worker worker5 Worker: computing range 5001 to 6250

Server: Received Sum: 2375296 workerChaos killing worker2

workerChaos already dead: worker2 Server: Received Sum: 3325284 workerChaos killing worker7

Watcher: Watching Worker worker7 Worker: computing range 7501 to 8750

Server: Received Sum: 5224570

workerChaos killing worker7

Watcher: Watching Worker worker7 Worker: computing range 7501 to 8750

Server: Received Sum: 4274384 workerChaos killing worker6

workerChaos already dead: worker6 Server: Received Sum: 7122972 workerChaos killing worker8

workerChaos already dead: worker8 Server: Received Sum: 8073526 workerChaos killing worker7

Watcher: Watching Worker worker7 Worker: computing range 7501 to 8750

Server: Received Sum: 9027346 workerChaos killing worker9

workerChaos already dead: worker9 Server: Received Sum: 9970596 workerChaos killing worker9

workerChaos already dead: worker9 [true,true,ok,true,true,ok,ktrue,ok,dk]

Server: Received Sum: 10925362 Server: Received Sum: 6175102 Server: Sum of totients: 68394316 Time taken in Secs, MicroSecs 6 610769

Section 5 Comparative Parallel Performance Measurements

Section 5.1 Runtimes

| Threads | Go | OpenMP | Erlang | |
|------------|-------------|----------|-----------|--|
| Sequential | 15.91639141 | 15.21514 | 27.560312 | |
| 1 | 16.35538 | 15.171 | 27.64324 | |
| 2 | 9.066147 | 7.592 | 21.84232 | |
| 4 | 4.740579 | 3.973 | 12.90331 | |
| 8 | 2.461242 | 2.06 | 7.674511 | |
| 12 | 1.647562 | 1.376 | 5.155668 | |
| 16 | 1.264213 | 1.041 | 3.84141 | |
| 24 | 0.972845 | 0.795 | 2.711483 | |
| 32 | 0.80053 | 0.649 | 2.310508 | |
| 48 | 0.801696 | 0.651 | 2.15471 | |
| 64 | 0.8027 | 0.653 | 1.877161 | |

Figure 2.1: Comparing C+OpenMP, Go and Erlang Parallel Runtimes for DS1

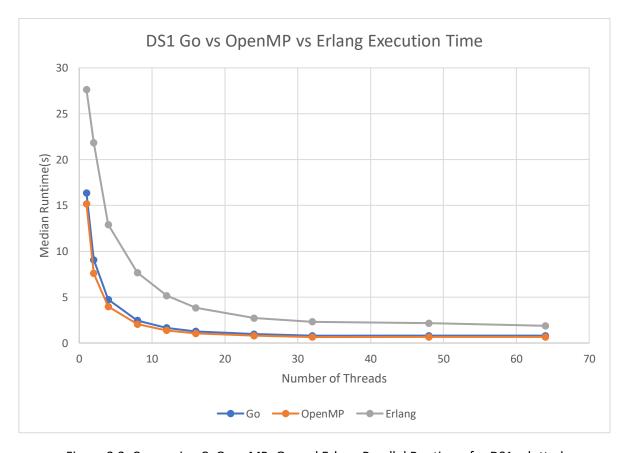


Figure 2.2: Comparing C+OpenMP, Go and Erlang Parallel Runtimes for DS1, plotted

| Threads | Go | OpenMP | Erlang | |
|------------|----------------------|----------|-----------|--|
| Sequential | 67.95405428 | 65.28168 | 118.87842 | |
| 1 | 1 69.91227 65.085 11 | | 117.7675 | |
| 2 | 38.36811 | 32.562 | 89.97294 | |
| 4 | 20.0648 | 17.042 | 56.27548 | |
| 8 | 10.40659 | 8.839 | 31.34113 | |
| 12 | 6.941679 | 5.894 | 21.14163 | |
| 16 | 5.227036 | 4.43 | 16.74621 | |
| 24 | 4.097904 | 3.399 | 12.12922 | |
| 32 | 3.376901 | 2.76 | 9.570727 | |
| 48 | 3.374534 | 2.761 | 7.924492 | |
| 64 | 3.377058 | 2.76 | 7.197233 | |

Figure 2.3: Comparing C+OpenMP and Go Parallel Runtimes for DS2

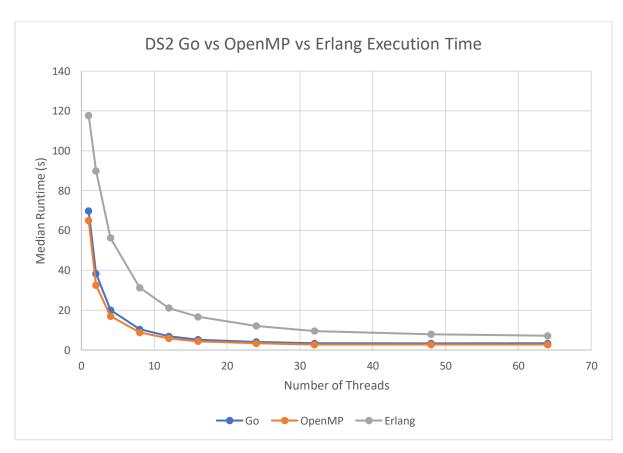


Figure 2.4: Comparing C+OpenMP, Go and Erlang Parallel Runtimes for DS2, plotted

| Threads | Go | OpenMP | Erlang |
|---------|----------|--------|----------|
| 8 | 43.90842 | 37.725 | 129.5024 |
| 16 | 22.00349 | 18.89 | 69.37089 |
| 32 | 14.206 | 11.741 | 42.37109 |
| 64 | 14.20571 | 11.741 | 32.1379 |

Figure 2.5: Comparing C+OpenMP and Go Parallel Runtimes for DS3

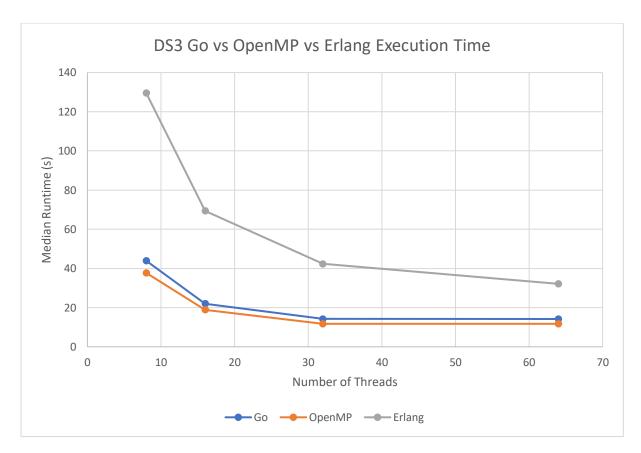


Figure 2.6: Comparing C+OpenMP, Go and Erlang Parallel Runtimes for DS3, plotted

Section 5.2 Speedups

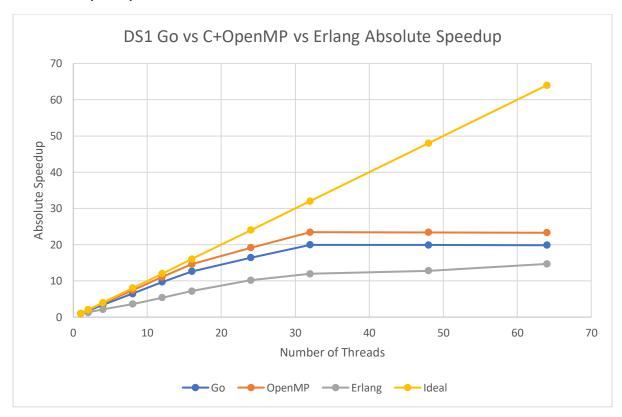


Figure 2.7: Comparing C+OpenMP, Go and Erlang Absolute Speedups for DS1

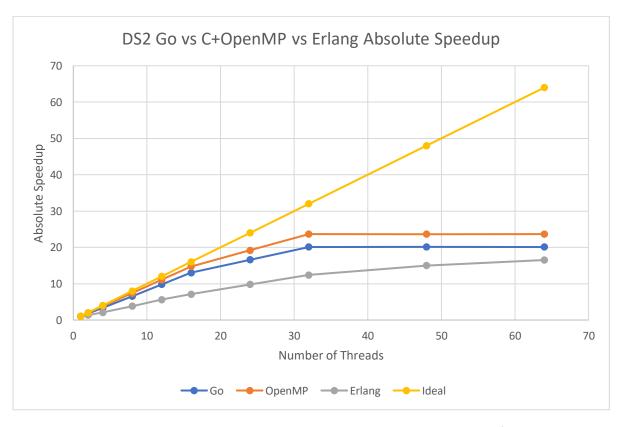


Figure 2.8: Comparing C+OpenMP, Go and Erlang Absolute Speedups for DS2

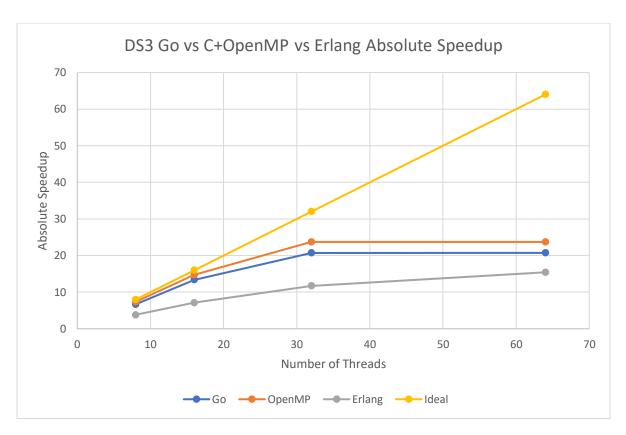


Figure 2.9: Comparing C+OpenMP, Go and Erlang Absolute Speedups for DS3

Section 5.3

| Language | Sequential | Best Parallel | Best Speedup | No. Threads |
|----------|-------------|---------------|--------------|-------------|
| | Runtime (s) | Runtime (s) | | |
| DS1 | | | | |
| Go | 15.91639 | 0.878035 | 19.93095 | 32 |
| C+OpenMP | 15.22271 | 0.822 | 23.44398 | 32 |
| Erlang | 27.56031 | 1.877161 | 14.68191 | 64 |
| DS2 | | | | |
| Go | 67.95405428 | 3.376901 | 20.1232 | 32 |
| C+OpenMP | 65.28168 | 2.76 | 23.65278 | 32 |
| Erlang | 118.8784 | 7.197233 | 16.51724 | 64 |
| DS3 | | | | |
| Go | 294.5406 | 14.206 | 20.73353 | 32 |
| C+OpenMP | 278.581 | 11.741 | 23.7272 | 32 |
| Erlang | 495.9446 | 32.1379 | 15.43177 | 64 |

Figure 2.10: Comparing C+OpenMP, Go and Erlang Parallel Runtimes and Speedups for all data sets

Section 5.4

Looking at the graphs, the runtimes for both Go and C+OpenMP seem very similar, with C+OpenMP being slightly faster on average in all cases. Looking at figure 2.10 however, we can see that C+OpenMP clearly outperforms Go for best parallel runtimes, which is more apparent in DS2 and DS3. This is even true for sequential runtimes.

Looking at the numbers for speedups, the results for DS1, DS2 and DS3 are very similar, with 32 threads providing ~20 times speedup on average for Go and ~24 times speedup on average for C+OpenMP. C+OpenMP consistently shows a significantly higher speedup than Go, which is immediately obvious starting threads>1. The graphs are mostly linear and inversely proportional (runtime is almost exactly half when number of threads are doubled), which suggests the parallelism is ideal, until it plateaus at 32 threads. By running omp_get_max_threads I found that 32 was the maximum number of cores in the gpg-nodes cluster (There are 32 CPUs) so this makes sense, as increasing the number of threads at this point would result in CPUs needing to context switch to give time to multiple threads.

It makes sense that C+OpenMP would be faster than Go because Go includes a garbage collector that will increase runtime, especially when handling a lot of data in a loop.

Erlang is noticeably slower than both C+OpenMP and Go. This is likely because those languages are designed to increase throughput, and hence perform better on CPU bound tasks (such as summing totients). Erlang on the other hand priorities low latency over high throughput, and hence is understandably slower.

The Erlang code could be tweaked to improve its speedup (just like how C+OpenMP and Go have been tuned). This would mean it's runtime would converge at 32 threads just like the other two languages. But since the code is currently not tuned, using more workers will decrease the runtime, as more workers equals smaller chunks, and the program execution time is capped by the final worker (since it has the largest numbers to sum).

Section 6 Programming Model Comparison

The Go and OpenMP models each have their advantages. Goroutines have very little overhead (minimum size 8kb) and fast startup times, and hence you can run many more of them (millions, if desired) than traditional threads. Goroutines are also simpler to manage, as mutexes are avoided and they will scale according to the complexity of the work. Goroutines are best used if development time and memory usage is a concern. I also found goroutines easier to grasp than OpenMP, as it is written in a traditional coding style. OpenMP with its one-line pragma comments was a little more unusual, so for programmers unfamiliar with parallelism I would recommend goroutines.

However, if peak performance is desired, then C+OpenMP should be used. It can be seen from my previous results in the totientRange application that C+OpenMP outperforms Go. The pragma paradigm in OpenMP is much simpler and easier to setup than pthreads and provides powerful tools for reductions. There are also scheduling styles (e.g. guided) that can adapt to the work being done and improve the efficiency of the runtimes.

The biggest challenge I had was deciding how to split the dataset into correctly sized chunks for the Go program. This was especially difficult as the count of goroutines would often not be a factor of the dataset (e.g. 60000 / 64) and due to Go's integer division always rounding down this could cause some numbers to be skipped/processed twice. I first experimented with converting the integers to floats and rounding explicitly, but this was messy and didn't guarantee the final upper number would be correct (e.g. could be rounded up to 60001). I then decided to use integer division to divide the dataset into a variable named chunk_size (threads*chunk_size < dataset because integer division rounds down). Each goroutine would process work of chunk_size, and the last goroutine would handle whatever was remaining. This guarantees that every number is processed and splits the data into almost even chunks.

However, I ultimately changed this to a round-robin style where goroutines are spawned and only deal with one number from a channel containing all numbers to be processed. This proved to be significantly faster than the original method (as seen in Appendix B).

My biggest challenge with OpenMP was figuring out how to tune it to run faster (I gathered that my runtimes weren't ideal from the original speedup graphs, as the results were not inversely proportional). This is discussed further in Appendix A.

Appendix A C+OpenMP TotientRange Program

Code:

```
// TotientRangePar.c - Parallel Euler Totient Function (C Version)
// compile: gcc -Wall -O2 -o TotientRangePar TotientRangePar.c
// run: ./TotientRangePar lower_num upper_num num_threads(optional)
// Author: Max Kirker Burton 2260452b 13/11/19
// This program calculates the sum of the totients between a lower and an
// upper limit using C longs, and can be run with several Goroutines either se
t as an argument or
// Phil Trinder, Nathan Charles, Hans-Wolfgang Loidl and Colin Runciman
// The comments provide (executable) Haskell specifications of the functions
#include <stdio.h>
#include <omp.h>
#include <sys/time.h>
// hcf x 0 = x
// hcf x y = hcf y (rem x y)
long hcf(long x, long y)
  long t;
 while (y != 0) {
   t = x \% y;
   x = y;
   y = t;
  return x;
// relprime x y = hcf x y == 1
int relprime(long x, long y)
 return hcf(x, y) == 1;
// euler n = length (filter (relprime n) [1 .. n-1])
long euler(long n)
```

```
long length, i;
  length = 0;
  for (i = 1; i < n; i++)
    if (relprime(n, i))
      length += 1;
  return length;
// sumTotient lower upper = sum (map euler [lower, lower+1 .. upper])
long sumTotient(long lower, long upper, int n_threads)
  long sum, i;
  sum = 0;
  #pragma omp parallel for schedule(guided) reduction(+: sum) num threads(n th
reads)
    for (i = lower; i <= upper; i++)</pre>
      sum += euler(i);
  return sum;
int main(int argc, char ** argv)
  long lower, upper;
  int num_threads = omp_get_num_threads();
  float msec;
  struct timeval start, stop;
  if (argc < 3) {
    printf("fewer than 2 arguments\n");
    return 1;
  sscanf(argv[1], "%ld", &lower);
  sscanf(argv[2], "%ld", &upper);
  if (argc == 4){
    sscanf(argv[3], "%d", &num_threads);
  gettimeofday(&start, NULL);
  printf("C: Sum of Totients between [%ld..%ld] is %ld\n",
         lower, upper, sumTotient(lower, upper, num_threads));
  gettimeofday(&stop, NULL);
  if (stop.tv_usec < start.tv_usec) {</pre>
    stop.tv_usec += 1000000;
```

Uses a Pragma-based Shared Memory paradigm (e.g. using shared variables and reduction for loops).

I used only one pragma in the final code, but I experimented with using nested pragmas, with another pragma inside of the euler function. I thought that I could parallelise the calculations of relprimes and tried assigning threads in different ways (e.g. 2 threads for the euler function, and all other threads for the sumTotient function) but all these methods resulted in similar or slower runtimes than simply using one pragma.

What did improve runtimes noticeably was changing the schedule parameter of the pragma. By default, it takes the "static" argument, which splits chunks into even sizes. Because my original Go program did something similar, I tried to find a way to improve the runtimes in OpenMP. I found that setting schedule to "guided" which starts chunk_size high then decreases it for later threads. This reduces runtime since higher numbers take longer to compute (explained in Appendix B).

The runtimes stop increasing after 32 threads, because the gpgnode cluster "only" has 32 CPUs. I tried adding multiple parallel sections to see if that could increase performance with threads > CPUs but all methods resulted in the same runtimes.

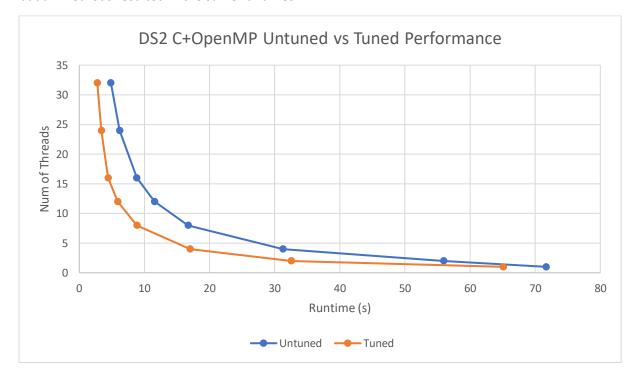


Figure 3.1: Comparing C+OpenMP runtime performance before and after tuning with DS2

Appendix B Go TotientRange Program

Code:

```
// totientRangePar.go - Parallel Euler Totient Function (Go Version)
// compile: go build
// run: totientRangePar lower_num upper_num num threads
// Author: Max Kirker Burton 2260452b 07/11/2019
// This program calculates the sum of the totients between a lower and an
// upper limit, and can be run with several Goroutines
// Each function has an executable Haskell specification
// It is based on earlier work by: Greg Michaelson, Patrick Maier, Phil Trinde
// Nathan Charles, Hans-Wolfgang Loidl and Colin Runciman
package main
import (
    "fmt"
    "os"
    "runtime"
    "strconv"
    "sync"
    "time"
// Compute the Highest Common Factor, hcf of two numbers x and y
func hcf(x, y int64) int64 {
   var t int64
    for y != 0 {
       t = x \% y
       x = y
       y = t
    return x
// relprime determines whether two numbers x and y are relatively prime
 '/ relprime x y = hcf x y == 1
```

```
func relprime(x, y int64) bool {
    return hcf(x, y) == 1
// sequential euler function
func euler_seq(n int64) int64 {
    var length, i int64
    length = 0
    for i = 1; i < n; i++ {
        if relprime(n, i) {
            length++
    return length
// euler(n) computes the Euler totient function, i.e. counts the number of
// positive integers up to n that are relatively prime to n
// euler n = length (filter (relprime n) [1 .. n-1])
func euler(value int64, ch chan int64, wg *sync.WaitGroup) {
    var length, i int64
    length = 0
    for i = 1; i < value; i++ {
        if relprime(i, value) {
            length++
        }
    ch <- length
    wg.Done()
// sumTotient lower upper sums the Euler totient values for all numbers
// between "lower" and "upper".
// sumTotient lower upper = sum (map euler [lower, lower+1 .. upper])
func sumTotient(lower, upper, cores int64) int64 {
   var sum, i int64
    sum = 0
    // If more than 1 core is being used, utilise parallelism, otherwise run s
equentially (with 1 core in this program, sequential is faster)
```

```
if cores > 1 {
        chIn := make(chan int64, 100000)
        chSum := make(chan int64, 100000)
        var goroutines int64 = cores
        runtime.GOMAXPROCS(int(goroutines))
        var wg sync.WaitGroup // using a waitgroup to close the channel after
all threads are completed
        // add all numbers in range of lower and upper to a channel
        for i = lower; i <= upper; i++ {</pre>
            chIn <- i
        close(chIn)
        // repeatedly spawn goroutines to take 1 entry in chIn and calculate i
ts totient, which is then sent onto channel chSum
        for value := range chIn {
           wg.Add(1)
            go euler(value, chSum, &wg)
        wg.Wait()
        close(chSum)
        // sum all values in channel chSum
        for value := range chSum {
            sum += value
    } else {
        for i = lower; i <= upper; i++ {
            sum = sum + euler_seq(i)
   return sum
func main() {
   var lower, upper, cores int64
    var err error
    // Read and validate lower and upper arguments
   if len(os.Args) < 3 {</pre>
        panic(fmt.Sprintf("Usage: must provide lower and upper range limits an
d number of cores as arguments"))
    if lower, err = strconv.ParseInt(os.Args[1], 10, 64); err != nil {
        panic(fmt.Sprintf("Can't parse first argument"))
    if upper, err = strconv.ParseInt(os.Args[2], 10, 64); err != nil {
```

```
panic(fmt.Sprintf("Can't parse second argument"))
}
if cores, err = strconv.ParseInt(os.Args[3], 10, 64); err != nil {
    panic(fmt.Sprintf("Can't parse third argument"))
}
// Record start time
start := time.Now()
// Compute and output sum of totients
fmt.Println("Sum of Totients between", lower, "and", upper, "is", sumTotie
nt(lower, upper, cores))

// Record the elapsed time
t := time.Now()
elapsed := t.Sub(start)
fmt.Println("Elapsed time", elapsed)
}
```

Uses a Message Passing paradigm (e.g. creating a channel with send and receives).

Originally my program didn't provide a large reduction in runtime because of how it separated work into chunks. My program split work into even chunks and calculating the sum of totients in a range 1-1000 would take much less time than 1000-2000, as more relative primes need to be calculated. Since I used a waitgroup to ensure all goroutines are completed before the sum of the channel is calculated, the program runtime will be the runtime of the slowest goroutine. This becomes less of a problem at higher counts of goroutines as the chunks are smaller. I thought of ways to have different sized chunks, with larger sized chunks for the earlier numbers (e.g. for a range of 2000 and 2 threads, split into chunks of 1-1500 and 1500-2000), but this proved difficult to implement, and would require heavy tuning to be optimal.

Instead, I changed my program to disregard chunk_size and instead spawn an arbitrary number of goroutines that only compute 1 number each, until all numbers are processed. This works as at the start of the program, all numbers are sent to a separate channel, and the goroutines receive one number from the channel to compute. This significantly improved runtimes compared to my original method, and reaches ideal parallelism based on absolute speedups (double the threads = half the runtime)

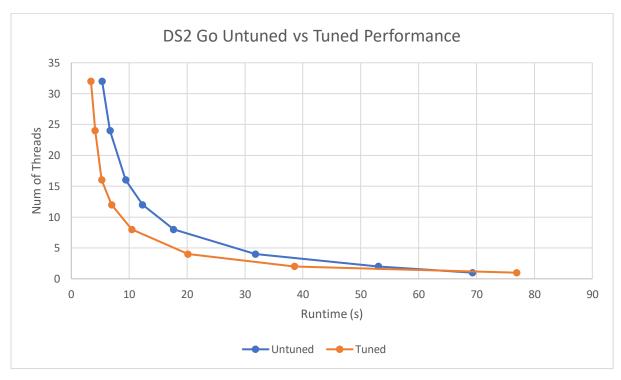


Figure 3.2: Comparing Go runtime performance before and after tuning with DS2

However, as you can see from the graph above, this method also increased the runtime for 1 thread. To improve that, I added an if statement that would run the program sequentially if only 1 core was set by runtime.GOMAXPROCS. The result is my final Go program.

Appendix C Erlang totientrange2Workers Program

```
-module(totientrange2Workers).
-export([hcf/2,
   relprime/2,
   euler/1,
     startServer/0,
     server/4,
     totientWorker/0
  ]).
%% totientrange2Workers.erl - Parellel Euler Totient Function (Erlang Version)
%% compile from the shell: >c(totientrange2Workers).
%% run from the shell: >totientrange2Workers:startServer().
                           >server ! {range, x, y}.
%% Max Kirker Burton 2260452b
%% This program calculates the sum of the totients between a lower and an
%% upper limit. It is based on earlier work by: Nathan Charles,
%% Hans-Wolfgang Loidl and Colin Runciman
%% The comments provide (executable) Haskell specifications of the functions
\% hcf x 0 = x
%% hcf x y = hcf y (rem x y)
hcf(X,0) -> X;
hcf(X,Y) -> hcf(Y,X rem Y).
\%\% relprime x y = hcf x y == 1
relprime(X,Y) ->
 V = hcf(X,Y),
 if
    V == 1
      -> true;
    true
      -> false
  end.
%%euler n = length (filter (relprime n) (mkList n))
euler(N) ->
  RelprimeN = fun(Y) -> relprime(N,Y) end,
  length (lists:filter(RelprimeN,(lists:seq(1,N)))).
%% Take completion timestamp, and print elapsed time
```

```
printElapsed(S,US) ->
  { , S2, US2} = os:timestamp(),
                       %% Adjust Seconds if completion Microsecs > start Micro
 if
    US2-US < 0 ->
      S3 = S2-1,
      US3 = US2+10000000;
    true ->
      S3 = S2,
      US3 = US2
  end.
  io:format("Time taken in Secs, MicroSecs ~p ~p~n",[S3-S,US3-US]).
%% We pass in these variables to keep their value over successive receive call
server(Total, Count, S, US) ->
    receive
        %% Check if all workers have finished, otherwise continue
        {finished, Sum} when Count < 1 ->
            io:format("Server: Received Sum: ~p~n", [Sum]),
            server(Total+Sum, Count+1, S, US);
        {finished, Sum} ->
            io:format("Server: Received Sum: ~p~n", [Sum]),
            io:format("Server: Sum of totients: ~p~n", [Total+Sum]),
            worker1 ! finished,
            worker2 ! finished,
            printElapsed(S,US);
        {range, Lower, Upper} ->
            {_, Sec, USec} = os:timestamp(),
            register(worker1, spawn(totientrange2Workers, totientWorker, [])),
            worker1 ! {range, Lower, trunc(Upper/2)},
            register(worker2, spawn(totientrange2Workers, totientWorker, [])),
            worker2 ! {range, trunc(Upper/2 + 1), Upper},
            server(Total, Count, Sec, USec)
    end.
%% calculate sumTotient on a subset of the dataset
totientWorker() ->
    receive
        finished ->
            io:format("Worker: finished~n", []);
        {range, Lower, Upper} ->
            io:format("Worker: computing range ~p to ~p~n", [Lower, Upper]),
            Sum = lists:sum(lists:map(fun euler/1,lists:seq(Lower, Upper))),
            server ! {finished, Sum},
            totientWorker()
    end.
```

```
%%start the server process
startServer() ->
    register(server, spawn(totientrange2Workers, server, [0, 0, 0, 0])).
```

Appendix D Erlang totientrangeNWorkers Program

```
-module(totientrangeNWorkers).
-export([hcf/2,
     relprime/2,
     euler/1,
     startServer/0,
     workerName/1,
     registerWorker/3,
     server/7,
     totientWorker/0
    ]).
%% totientrangeNWorkers.erl - Parallel Euler Totient Function (Erlang Version)
%% compile from the shell: >c(totientrangeNWorkers).
%% run from the shell: >totientrangeNWorkers:startServer().
                           >server ! {range, x, y, N}.
%% Max Kirker Burton 2260452b
%% This program calculates the sum of the totients between a lower and an
%% upper limit. It is based on earlier work by: Nathan Charles,
%% Hans-Wolfgang Loidl and Colin Runciman
%% The comments provide (executable) Haskell specifications of the functions
\% hcf x 0 = x
%% hcf x y = hcf y (rem x y)
hcf(X,0) \rightarrow X;
hcf(X,Y) -> hcf(Y,X rem Y).
%% relprime x y = hcf x y == 1
relprime(X,Y) ->
 V = hcf(X,Y),
   V == 1
      -> true;
    true
      -> false
  end.
%%euler n = length (filter (relprime n) (mkList n))
euler(N) ->
 RelprimeN = fun(Y) -> relprime(N,Y) end,
  length (lists:filter(RelprimeN,(lists:seq(1,N)))).
```

```
%% Take completion timestamp, and print elapsed time
printElapsed(S,US) ->
 {_, S2, US2} = os:timestamp(),
                       %% Adjust Seconds if completion Microsecs > start Micro
secs
 if
   US2-US < 0 ->
     S3 = S2-1,
     US3 = US2+10000000;
    true ->
      S3 = S2
      US3 = US2
  io:format("Time taken in Secs, MicroSecs ~p ~p~n",[S3-S,US3-US]).
workerName(Num) ->
    list_to_atom( "worker" ++ integer_to_list( Num )).
workerNames([]) ->
    0;
workerNames(Range) ->
    [Head | Rest] = Range,
    WorkerName = workerName(Head),
    server ! {names, WorkerName, Head},
    workerNames(Rest).
registerWorker(WorkerNum, Lower, Upper) ->
    register(WorkerNum, spawn(totientrangeNWorkers, totientWorker, [])),
    WorkerNum ! {range, Lower, Upper}.
%% We pass in these variables to keep their value over successive receive call
server(Total, Count, Lower, Upper, N_workers, S, US) ->
    receive
        %% Check if all workers have finished, otherwise continue
        {finished, Sum, Pid} when Count < (N_workers-1) ->
            io:format("Server: Received Sum: ~p~n", [Sum]),
            Pid! finished,
            server(Total+Sum, Count+1, Lower, Upper, N_workers, S, US);
        {finished, Sum, Pid} ->
            io:format("Server: Received Sum: ~p~n", [Sum]),
            io:format("Server: Sum of totients: ~p~n", [Total+Sum]),
            Pid! finished,
            printElapsed(S,US);
        %% if this is the first worker, start from Lower
        {names, WorkerNum, Num} when Num == 1 ->
            LocalLower = Lower,
```

```
LocalUpper = Lower + trunc(((Upper - Lower)/N_workers) * (Num)),
            registerWorker(WorkerNum, LocalLower, LocalUpper),
            server(Total, Count, Lower, Upper, N workers, S, US);
        %% if this is the last worker, set the Upper limit
        {names, WorkerNum, Num} when Num == N workers ->
            LocalLower = 1 + Lower + trunc(((Upper - Lower)/N_workers) * (Num
- 1)),
            LocalUpper = Upper,
            registerWorker(WorkerNum, LocalLower, LocalUpper),
            server(Total, Count, Lower, Upper, N_workers, S, US);
        %% otherwise calculate an equal range
        {names, WorkerNum, Num} ->
            LocalLower = 1 + Lower + trunc(((Upper - Lower)/N_workers) * (Num
- 1)),
            LocalUpper = Lower + trunc(((Upper - Lower)/N workers) * (Num)),
            registerWorker(WorkerNum, LocalLower, LocalUpper),
            server(Total, Count, Lower, Upper, N_workers, S, US);
        {range, L, U, N} ->
            {_, Sec, USec} = os:timestamp(),
            Range = lists:seq(1, N),
            workerNames(Range),
            server(Total, Count, L, U, N, Sec, USec)
    end.
%% calculate sumTotient on a subset of the dataset
totientWorker() ->
    receive
        finished ->
            io:format("Worker: finished~n", []);
        {range, Lower, Upper} ->
            io:format("Worker: started~n", []),
            io:format("Worker: computing range ~p to ~p~n", [Lower, Upper]),
            Sum = lists:sum(lists:map(fun euler/1,lists:seq(Lower, Upper))),
            server ! {finished, Sum, self()},
            totientWorker()
    end.
%%start the server process
startServer() ->
    register(server, spawn(totientrangeNWorkers, server, [0, 0, 0, 0, 0, 0, 0]
)).
```

Appendix E Erlang totientrangeNWorkersReliable Program

```
-module(totientrangeNWorkersReliable).
-export([hcf/2,
     relprime/2,
     euler/1,
     startServer/0,
     workerNames/1,
     workerName/1,
     registerWorker/3,
     server/7,
     totientWorker/0,
     watcher/3,
     workerChaos/2,
     testRobust/2
    ]).
%% totientrangeNWorkersReliable.erl - Parallel & Reliable Euler Totient Functi
on (Erlang Version)
%% compile from the shell: >c(totientrangeNWorkersReliable).
%% run from the shell: >totientrangeNWorkersReliable:startServer().
%%
                           >server ! {range, x, y, N}.
%% Max Kirker Burton 2260452b
%% This program calculates the sum of the totients between a lower and an
%% upper limit. It is based on earlier work by: Nathan Charles,
%% Hans-Wolfgang Loidl and Colin Runciman
%% The comments provide (executable) Haskell specifications of the functions
\% hcf x 0 = x
%% \text{ hcf } x y = \text{hcf } y \text{ (rem } x y)
hcf(X,0) \rightarrow X;
hcf(X,Y) -> hcf(Y,X rem Y).
%% relprime x y = hcf x y == 1
relprime(X,Y) ->
 V = hcf(X,Y),
    V == 1
      -> true;
    true
      -> false
  end.
%%euler n = length (filter (relprime n) (mkList n))
```

```
euler(N) ->
  RelprimeN = fun(Y) -> relprime(N,Y) end,
  length (lists:filter(RelprimeN,(lists:seq(1,N)))).
%% Take completion timestamp, and print elapsed time
printElapsed(S,US) ->
  {_, S2, US2} = os:timestamp(),
                       %% Adjust Seconds if completion Microsecs > start Micro
secs
 if
   US2-US < 0 ->
     S3 = S2-1,
     US3 = US2+10000000;
    true ->
      S3 = S2,
      US3 = US2
  end,
  io:format("Time taken in Secs, MicroSecs ~p ~p~n",[S3-S,US3-US]).
%% Generate a worker name with a given number
workerName(Num) ->
    list_to_atom( "worker" ++ integer_to_list( Num )).
%% Recursively generate worker names from a sequential list
workerNames([]) ->
    0;
workerNames(Range) ->
    [Head | Rest] = Range,
    WorkerName = workerName(Head),
    server ! {names, WorkerName, Head},
    workerNames(Rest).
%% register a worker, then pass a message to it
registerWorker(WorkerNum, Lower, Upper) ->
    register(WorkerNum, spawn_link(totientrangeNWorkersReliable, totientWorker
, [])),
    WorkerNum ! {range, Lower, Upper}.
%% We pass in these variables to keep their value over successive receive call
server(Total, Count, Lower, Upper, N_workers, S, US) ->
    receive
        %% Check if all workers have finished, otherwise continue
        {finished, Sum, Pid} when Count < (N_workers-1) ->
            io:format("Server: Received Sum: ~p~n", [Sum]),
            Pid! finished,
```

```
server(Total+Sum, Count+1, Lower, Upper, N_workers, S, US);
        {finished, Sum, Pid} ->
            io:format("Server: Received Sum: ~p~n", [Sum]),
            io:format("Server: Sum of totients: ~p~n", [Total+Sum]),
            Pid! finished,
            printElapsed(S,US);
        %% if this is the first worker, start from Lower
        {names, WorkerNum, Num} when Num == 1 ->
            LocalLower = Lower,
            LocalUpper = Lower + trunc(((Upper - Lower)/N_workers) * (Num)),
            spawn(totientrangeNWorkersReliable, watcher, [WorkerNum, LocalLowe
r, LocalUpper]),
            server(Total, Count, Lower, Upper, N_workers, S, US);
        %% if this is the last worker, set the Upper limit
        {names, WorkerNum, Num} when Num == N workers ->
            LocalLower = 1 + Lower + trunc(((Upper - Lower)/N_workers) * (Num
- 1)),
            LocalUpper = Upper,
            spawn(totientrangeNWorkersReliable, watcher, [WorkerNum, LocalLowe
r, LocalUpper]),
            server(Total, Count, Lower, Upper, N_workers, S, US);
        %% otherwise calculate an equal range
        {names, WorkerNum, Num} ->
            LocalLower = 1 + Lower + trunc(((Upper - Lower)/N_workers) * (Num
- 1)),
            LocalUpper = Lower + trunc(((Upper - Lower)/N_workers) * (Num)),
            spawn(totientrangeNWorkersReliable, watcher, [WorkerNum, LocalLowe
r, LocalUpper]),
            server(Total, Count, Lower, Upper, N_workers, S, US);
        {range, L, U, N} ->
            {_, Sec, USec} = os:timestamp(),
            Range = lists:seq(1, N),
            workerNames(Range),
            server(Total, Count, L, U, N, Sec, USec)
    end.
%% If an exit message is received and the worker had not completed, trap it an
d respawn the linked worker
watcher(WorkerNum, LocalLower, LocalUpper) ->
    process_flag(trap_exit, true),
    registerWorker(WorkerNum, LocalLower, LocalUpper),
    io:format("Watcher: Watching Worker ~p~n", [WorkerNum]),
    receive
        Msg ->
            {_Message, _Pid, Reason} = Msg,
            if
                Reason == chaos ->
                   watcher(WorkerNum, LocalLower, LocalUpper);
```

```
true ->
                    0
            end
    end.
%% calculate sumTotient on a subset of the dataset
totientWorker() ->
    receive
        finished ->
            0;
        {range, Lower, Upper} ->
            io:format("Worker: computing range ~p to ~p~n", [Lower, Upper]),
            Sum = lists:sum(lists:map(fun euler/1,lists:seq(Lower, Upper))),
            server ! {finished, Sum, self()},
            totientWorker()
    end.
workerChaos(NVictims, NWorkers) ->
    lists:map(
        fun( _ ) ->
            timer:sleep(500),
                                %% Sleep for .5s
                                %% Choose a random victim
            WorkerNum = rand:uniform(NWorkers),
            io:format("workerChaos killing ~p~n",
                      [workerName(WorkerNum)]),
            WorkerPid = whereis(workerName(WorkerNum)),
            if %% Check if victim is alive
                WorkerPid == undefined ->
                    io:format("workerChaos already dead: ~p~n",
                              [workerName(WorkerNum)]);
                true -> %% Kill Kill Kill
                    exit(whereis(workerName(WorkerNum)), chaos)
                end
            end,
            lists:seq( 1, NVictims ) ).
testRobust(NWorkers, NVictims) ->
    ServerPid = whereis(server),
    if %% Is server already running?
        ServerPid == undefined ->
            startServer();
        true ->
            ok
    server ! {range, 1, 15000, NWorkers},
    workerChaos(NVictims,NWorkers).
%%start the server process
```

```
startServer() ->
    register(server, spawn(totientrangeNWorkersReliable, server, [0, 0, 0, 0, 0, 0])).
```