# Reduced Matrix Multiplication Report

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The link for the github repository: Reduced Matrix Multiplication

#### Part A

In this part of the assignment, we are supposed to implement single threaded and multi-threaded Reduced Matrix Multiplication(RMM). Naive implementation is given for reference.Improving the performance of the operation can be achieved using many ways. In the previous assignment, we explored improvement by using blocked matrix multiplication and loop interchange.We observed significant improvement using those techniques. In this assignment we use vector instructions to exploit data parallelism. We make a avx vector if 256 bits/4 integers and do the addition and multiplication operations with the corresponding vectors of the other matrix.We also use loop interchange to utilise locality of reference.We observe significant improvement over naive implementation of RMM.The reason for the improvement is using data parallelism, SIMD instructions, where a single instruction is fetched and decoded but executed on multiple elements.In multi-threaded implementation we use 8 threads . Each thread is responsible for calculating RMM for (N/8) number of rows of resultant matrix where N is the size of resultant matrix.

#### Observations

We make the graphs of the different counters we used to compare the performance. We compare the performance on the following parameters:

- 1. Time
- 2. L1 Read Miss
- 3. LL Read Miss
- 4. LL Write Miss
- 5. TLB Miss
- 6. Page Faults

#### **Observation Table**

SIZE	TIME	L1 READ MISS	LL READ MISS	LL WRITE MISS	TLB MISS	PAGE FAULT
16	0.107	37	0	0	1	0
16	0.08	43	0	0	0	0
16	0.831	1460	64	10	179	16
4096	986309	30981154829	18278461380	311788	17350628081	0
4096	258387	11289280138	5115642215	179371	6813772779	40917
4096	42577.9	1830	392	91	373	30
8192	8539590	2.96909E+11	1.33618E+11	1529653	1.39737E+11	0
	16 16 16 4096 4096 4096	16 0.107 16 0.08 16 0.831 4096 986309 4096 258387 4096 42577.9	SIZE   TIME   MISS     16   0.107   37     16   0.08   43     16   0.831   1460     4096   986309   30981154829     4096   258387   11289280138     4096   42577.9   1830	SIZE   TIME   MISS   MISS     16   0.107   37   0     16   0.08   43   0     16   0.831   1460   64     4096   986309   30981154829   18278461380     4096   258387   11289280138   5115642215     4096   42577.9   1830   392	SIZE     TIME     L1 READ MISS     LL READ MISS     WRITE MISS       16     0.107     37     0     0       16     0.08     43     0     0       16     0.831     1460     64     10       4096     986309     30981154829     18278461380     311788       4096     258387     11289280138     5115642215     179371       4096     42577.9     1830     392     91	SIZE     TIME     L1 READ MISS     LL READ MISS     WRITE MISS     TLB MISS       16     0.107     37     0     0     1       16     0.08     43     0     0     0       16     0.831     1460     64     10     179       4096     986309     30981154829     18278461380     311788     17350628081       4096     258387     11289280138     5115642215     179371     6813772779       4096     42577.9     1830     392     91     373

IMPLEMENTATION	SIZE	TIME	L1 READ MISS	LL READ MISS	LL WRITE MISS	TLB MISS	PAGE FAULT
SINGLE-THREADED	8192	2549420	1.1181E+11	52095504886	3581961	55496798295	32768
MULTI-THREADED	8192	421384	1667	429	79	420	38
REFERENCE	16384	69689700	3.06613E+12	1.85347E+12	8174646	1.12464E+12	8337199
SINGLE-THREADED	16384	23426700	9.64299E+11	5.60175E+11	16979372	4.64353E+11	419786
MULTI-THREADED	16384	3457470	1805	594	108	495	42

Looking at the tale, we observe that the numbers are too high, so for ease of plotting them on the graph, we simply take the performance improvement ratio. For each parameter it is calculated by: (Reference Value/Improved Value).

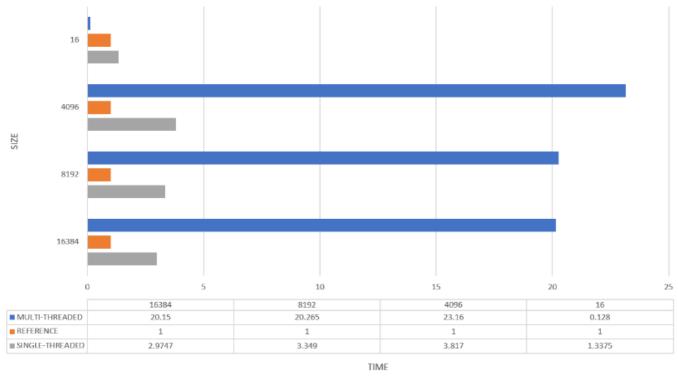
## Improvement Ratio Table

IMPLEMENTATION	SIZE	TIME	
REFERENCE	16	1	
SINGLE-THREADED	16	1.3375	
MULTI-THREADED	16	0.128	
REFERENCE	4096	1	
SINGLE-THREADED	4096	3.817	
MULTI-THREADED	4096	23.16	
REFERENCE	8192	1	
SINGLE-THREADED	8192	3.349	
MULTI-THREADED	8192	20.265	
REFERENCE	16384	1	
SINGLE-THREADED	16384	2.9747	
MULTI-THREADED	16384	20.15	

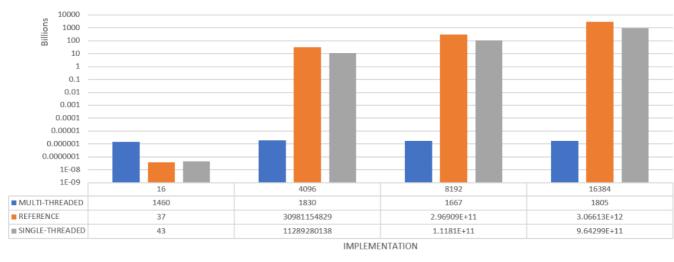
As we look into the table, we observe that for very small matrix sizes, the performance for naive implementation is better than single and multi-threaded. This is because creating the vector variables from data in matrix takes significant percentage of entire execution time. As we keep increasing the size, the usage of vector instructions becomes more prominent. Among the three implementations, the multi-threaded performed the best as expected. It performs the best beause firstly, it uses loop interchange utilising locality of reference, secondly vector instructions to exploit data parallelism and finally multi-threading which divides the tasks among multiple threads and which can be processed parallely.

### Charts

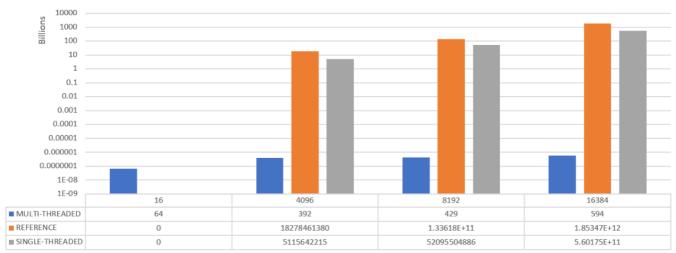




#### All of these charts are in logarithm scale.

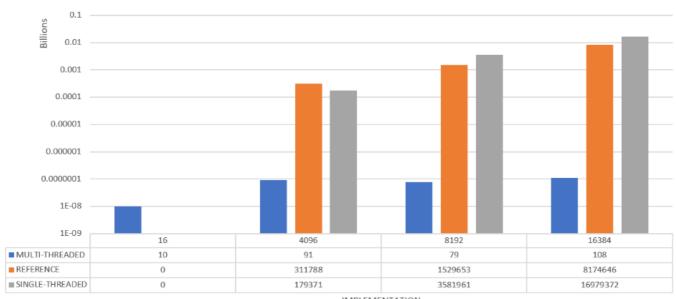


■ MULTI-THREADED ■ REFERENCE ■ SINGLE-THREADED

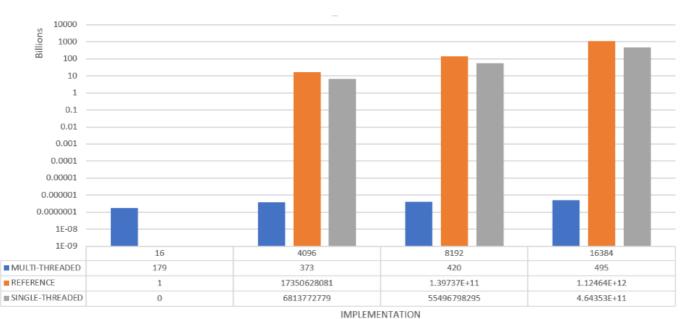


IMPLEMENTATION



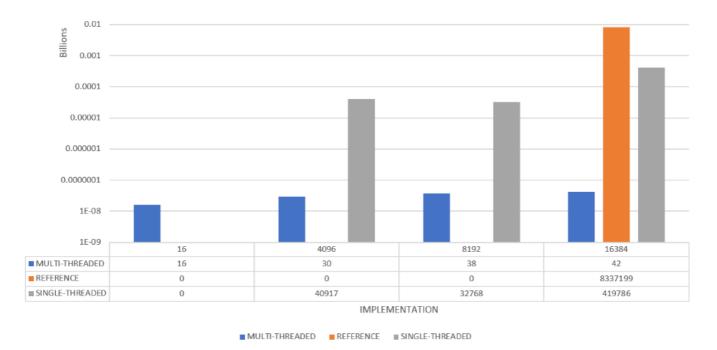


IMPLEMENTATION



■ MULTI-THREADED ■ REFERENCE ■ SINGLE-THREADED

■ MULTI-THREADED ■ REFERENCE ■ SINGLE-THREADED



Part B