

RECONFIGURABLE COMPUTING IP CORES FOR MULTIPLE SEQUENCE ALIGNMENT

M. Lakka, A. Desarti, G. Chrysos, E. Sotiriades, I. Papaefstathiou and A. Dollas
*Microprocessor and Hardware Laboratory, Department of Electronic and Computer Engineering
Technical University of Crete, Chania, Greece*

Keywords: Multiple Sequence Alignment, Reconfigurable Architecture, Bioinformatics.

Abstract: Multiple Sequence Alignment (MSA) is a principal tool in computational molecular biology. MSA is considered to be a very challenging problem as many software implementations suffer from quadratic time performance. Two of the best known MSA algorithms, which offer high accuracy and great speed, are T-Coffee and MAFFT. Reconfigurable technology provides a dramatic reduction of execution time by taking advantage of high parallelism. It also allows for different problem sizing solutions within a generic intellectual property (IP) core. This paper presents the implementation of MAFFT and T-Coffee algorithms on present-day Field Programmable Gate Arrays (FPGAs). The performance of the FPGA systems is compared against software implementations, concluding that the parallelism of reconfigurable technology can offer significant computational power to the bioinformatics community.

1 INTRODUCTION

Multiple Sequence Alignment (MSA) organizes a series of different DNA sequences by finding the best alignments between them. MSA is a powerful tool for phylogenetic analysis, protein structure prediction, homology detection between sequences and protein family identification. MSA is considered to be a computationally difficult problem and most formulations of it lead to NP-complete combinatorial problems.

As sequence alignment is considered of great importance in molecular biology, many algorithms with different features have been proposed and implemented. Some of the best known are ClustalW (Thompson et al., 1994), T-Coffee (Notredame et al., 2000), MAFFT (Katoh et al., 2005), Muscle (Edgar, 2004), ProbCons (Do et al., 2005) and Dialign (Morgenster et al., 1998).

Many algorithms give a solution to the MSA problem but two of them are used most extensively by the broader community of biologists: MAFFT (Katoh et al. 2005) and T-Coffee (Notredame et al., 2000). MAFFT is a method for rapid multiple sequence alignment based on Fast Fourier Transform and it offers drastic reduction of the execution time when compared to other MSA

methods. T-Coffee provides great results in accuracy at a modest sacrifice in speed.

Reconfigurable computing can offer flexible architectures with significant performance in various applications. Specifically, for several bioinformatics problems many special-purpose architectures have been proposed. Since the early 90's more than 10 different research groups have proposed and studied architectures for all the important sequence comparison algorithms. Special purpose reconfigurable architectures have also been proposed for Phylogenetic trees, RNA and protein structure prediction, Sequence Homology and Gene Finding.

The community of reconfigurable hardware has shown great interest in accelerating the process of multiple sequence alignment. Oliver et al. (Oliver et al., 2005) used reconfigurable hardware to accelerate multiple sequence alignment of the ClustalW algorithm. Xu Lin et al. in (Xu Lin et al., 2005) analyzed the complexity of ClustalW algorithm and proposed a strategy to implement efficiently the algorithm on a Field Programmable Gate Array (FPGA). Boukerche et al. (Boukerche et al., 2007) describe the hardware architecture of the most computationally demanding parts of DIALIGN algorithm on FPGAs. Shingo Masuno et al. in (Masuno et al., 2007), developed on an FPGA a system which implements the Carillo-Lipman

method. It is obvious that FPGAs offer good platform for the implementation of systems for multiple sequence alignment.

The FPGA technology is based on repetitive patterns of hardware resources (memories, logic, DSPs) and their interconnection, all of which can be re-programmed. The proposed architectures of systems, like those described above, can be either co-processors that implement the heaviest computing part of the algorithm, or they can be stand-alone systems that produce results, or, finally, they can be intellectual property (IP) cores which are flexible designs that can be used as a design library.

The main contribution of this work is the architecture of two IP cores to implement two of the European Bioinformatics Institute (EBI) preferred and supported algorithms. This paper presents two new, parallel architectures of IP cores which implement the computationally demanding parts of MAFFT and T-Coffee algorithms. There is an analysis of the algorithms and a presentation of the parallel parts that are implemented on an FPGA, together with the specific advantages of FPGAs vs. other technologies. As far as the authors know, this is the first hardware-based approach to execute the MAFFT and T-Coffee algorithms directly on hardware.

The rest of this paper is organized as follows: Section 2 describes the T-Coffee and MAFFT algorithms and analyzes their nature. Section 3 describes the architecture of the implemented systems and Section 4 describes the performance for both implementations. Finally, Section 5 has some conclusions from this work.

2 MSA ALGORITHMS AND SOFTWARE ANALYSIS

This section describes the basic steps of the implemented algorithms, T-Coffee and MAFFT.

2.1 The T-Coffee Method

T-Coffee algorithm is a progressive method for multiple sequence alignment. T-Coffee works ideally with datasets of 50 sequences (maximum) and length 2000 of the sequences (maximum). If the input is greater than this, the method uses a heuristic function and it loses its accuracy.

The algorithm comprises of three steps. The first step constructs a library with the pairwise alignments between all the input sequences. The second step extends the library by assigning a

weight for each pair of residue. The final step of the method implements the progressive alignment strategy.

2.2 The MAFFT Method

MAFFT algorithm is a progressive method based on the Fast Fourier Transform (FFT). The MAFFT method has a new, improved scoring system and a huge speedup as compared to other existing methods.

MAFFT consists of three basic steps. Initially, a distance matrix between all the pairs of input sequences is constructed. Second, a progressive guide tree is created from the distances with the Unweighted Pair Group Method with Arithmetic Mean. Finally, input sequences are progressively aligned following the guide tree and using the FFT algorithm and the normalized scoring system.

2.3 Software Analysis

In order to evaluate the performance bottlenecks, the software implementations for T-Coffee and MAFFT were analyzed. Both original software editions of the algorithms were profiled with the Performance Analyzer for Linux (Edition 9.1).

The profiling of T-Coffee algorithm showed that the most computationally demanding part is the calculation of the alignment score between either two residues or two lists of residues. The execution time of this part reaches up to 67% of the total execution time of the algorithm.

The software analysis of the MAFFT algorithm showed that the sequence alignment process, which is the final step of the algorithm, takes up to 80% of total algorithm execution time.

The software analysis showed that the implementation of the algorithms' hotspots on reconfigurable technology would reduce the total execution times.

3 IP CORES RECONFIGURABLE ARCHITECTURES

This section describes the architecture and the design of the two implemented MSA algorithms. The implemented architectures can be used in lieu of the software functions which calculate the alignment score for the input sequence, thus accelerating the total performance. The hardware/software partitioning was modelled with the OSMOSIS tools, which were developed under the corresponding EU

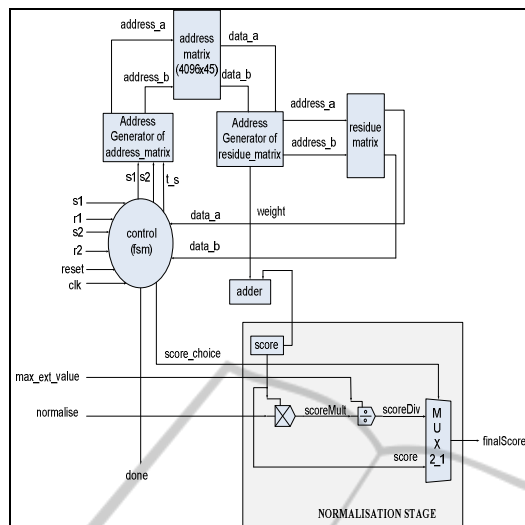


Figure 1: Residue Cost Evaluation Module Architecture.

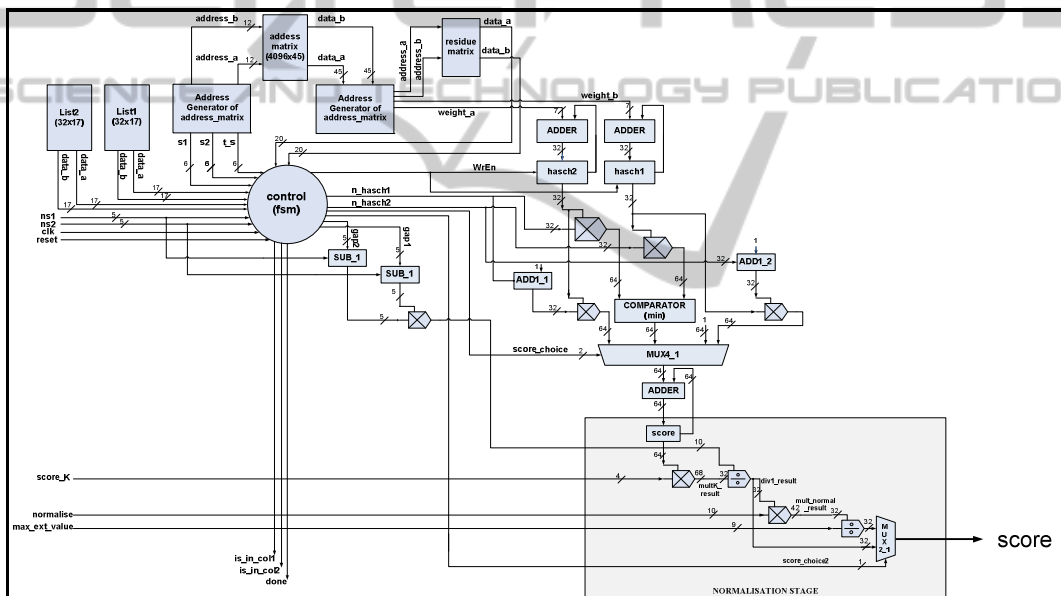


Figure 2: Constraint List Cost Evaluation Module Architecture.

project (see acknowledgments).

3.1 T-Coffee IP Core Architecture

The architecture of the T-Coffee IP core consists of two main sub-modules which are used for the two different parts of the software hotspots. The first module calculates the alignment score between two residues, whereas the second one calculates the alignment score between two lists of residues.

The Residue Cost Evaluation sub-module, shown in Figure 1, takes as input the IDs of two residues from different sequences and calculates the score of

their alignment. The calculation of the score is based on a 3-dimensional lookup table which is pre-loaded offline to the IP-core for each new input dataset of sequences. In our architecture the 3D lookup table is organized into a two-level memory hierarchy.

Fixed-point arithmetic was used for the normalization stage of the final score, without losing accuracy vs. the software, as the nature of the algorithm gives the opportunity of accuracy reduction without altering the final results.

The Constraint List Cost Evaluation sub-module, shown in Figure 2, calculates the alignment score between the residues of two input lists. It takes as

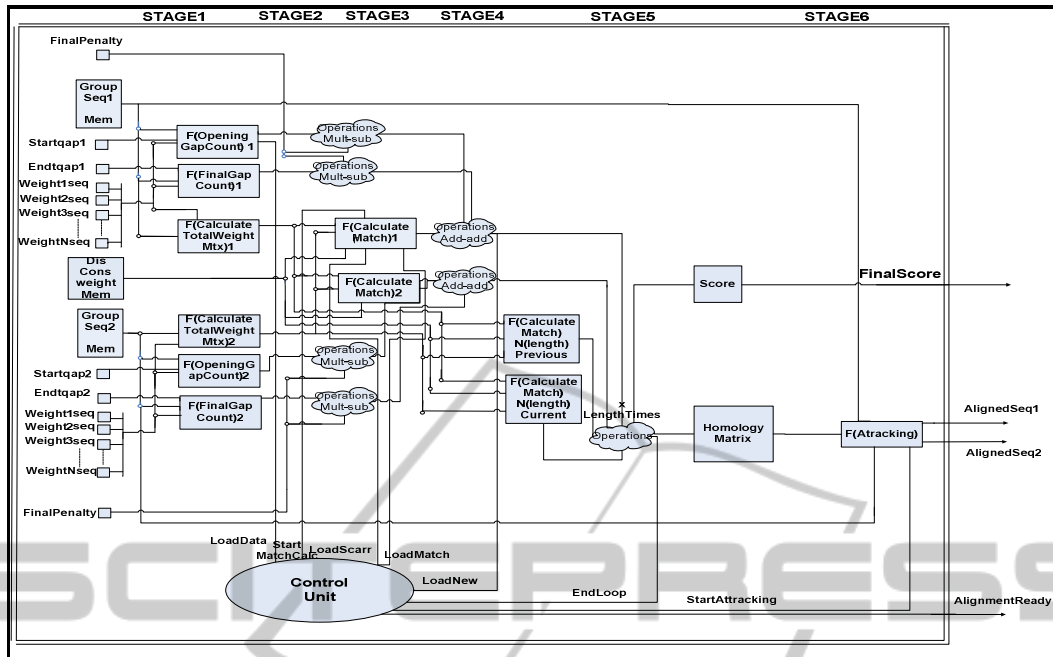


Figure 3: Architecture of MAFFT IP Core.

input two lists of residues from different input sequences and the numbers of the list elements.

The final score is the total sum of the alignment scores between all different pairs of the input residues according to the scoring scheme that was followed by the Residue Cost evaluation Module.

The normalization stage normalizes the final score according to the software implementation. The normalization process, as shown in Figure 2, was implemented using fixed point arithmetic, with greater accuracy than the previous module, as the score in this case is the sum of many different alignments.

3.2 MAFFT IP Core Architecture

This section describes the architecture of the MAFFT IP core, shown in Figure 3. The proposed architecture implements the final step of the MAFFT algorithm as it takes segments of the input sequences and outputs the aligned sequences with their alignment score.

The architecture consists of six-pipelined stages. The IP core takes as input the weights of the homologous input sequences and their weights, as shown in Figure 3. The first four stages calculate the gap penalties and the weight matrices among the input sequences. The most complex stage of the architecture is the fifth one, which calculates the final alignment score between the aligned sequences

and outputs the final homology matrix of the input sequences where the sequences are aligned. The final stage implements the final modification of the sequence alignment.

Single precision floating point arithmetic was used for the implementation of all the above arithmetic structures without losing any accuracy vs. the software implementation.

Concluding, data transfer is one of major concerns for these IPs. There exist implementations of different I/O interfaces giving high data transfer rates, such as Gigabit Ethernet and PCIe, both of which are supported by FPGA devices. The transfer rate for these two interfaces can reach an aggregate speed of up to 750 MB/sec, which is satisfactory enough for the implemented algorithms' demands, but special care have to be taken in the system that integrates these IPs in order to fully exploit these speeds. Thus, the time needed for the data I/O of the implemented modules is negligible.

4 EXPERIMENTAL RESULTS

This section presents the results of the two IP cores and compares their performance vs. the original software implementations of the algorithms. The performance of software implementations was computed on an Intel Pentium 4, 2, 66 GHz, with 1 GB RAM and with the Ubuntu 8.04.2 operating

Table 1: T-COFFEE IP Cores Implementation for Residue Alignment.

Input Sequences (No of sequences, Sequence length)	SW Residue Alignment Execution Time(sec)	FPGA Residue Alignment Execution Time(sec)	Speedup FPGA vs. Software for Residue Alignment (1 IP Core)	Speedup FPGA vs. SW for indicative parallelism on Virtex 6 (XCV6SX475T)
lidy_ref2 (22, 65)	2.59	5.76	0.45 x	9.9 x
lwit_ref2 (22, 117)	3.15	10.16	0.31 x	6.8 x
lag8_ref4 (19, 549)	12.92	323	0.04 x	0.9 x

Table 2: T-COFFEE IP Cores Implementation for Constraint List Residue Alignment.

Input Sequences (No of sequences, Sequence length)	SW List Alignment Execution Time (sec)	FPGA List Alignment Execution Time (sec)	Speedup FPGA vs. Software for List Alignment (1 IP Core)	Speedup FPGA vs. SW for indicative parallelism on Virtex 6 (XCV6SX475T)
lidy_ref2 (22, 65)	0.70	3.5	0.2 x	4.4 x
lwit_ref2 (22, 117)	1.08	10.9	0.1 x	2.2 x
lag8_ref4 (19, 549)	4.29	43.0	0.1 x	2.2 x

Table 3: MAFFT IP Core Implementation.

Input Sequences (No of sequences, Sequence length)	SW MAFFT Alignment Execution Time (sec)	HW MAFFT Alignment (sec)	Speedup FPGA vs. Software (1 IP Core)	Indicative parallelism on Virtex 6 (XCV6SX475T)	Speedup FPGA vs. SW for indicative parallelism on Virtex 6 (XCV6SX475T)
Samplerna (5, 366)	0.007	0.0084	0.83 x	14	11.6 x
flydna10x766(10, 766)	0.10	0.03	3.66 x	14	51.2 x
flydna100x766 (100, 766)	0.54	0.14	3.86 x	14	54.1 x
flydna100x1403 (100, 1403)	1.25	0.24	5.3 x	2	10.6 x

place and route simulated (cycle-accurate simulation) using the Xilinx ISE 10.1 tool. Their output results were verified against the original software.

Both architectures implement the alignment between two groups of sequences. For the complete process of the multiple sequence alignment all possible groups of sequences need to be aligned. This led us to implement several parallel systems of IP cores which work independently on alignment sequences for each input.

4.1 T-Coffee IP Core Results

The T-Coffee IP core was fully designed for a Xilinx Virtex 4(XC4VFX140) FPGA and it was tested with three different inputs, as shown in Tables 1 and 2.

The clock rate of the proposed architecture is 146 MHz. The FPGA utilization is very low, offering the chance of high parallelism. The critical resource of the implemented IP cores is Block RAMs, and for the larger datasets the coverage is only 17% of the total amount of the Block RAMs.

Tables 1 and 2 show i) the software run time for the calculation of the two alignment scores (residue alignment and list alignment), ii) the corresponding time using one IP core, iii) the corresponding speedups for three different datasets and iv) the indicative speedup that can be achieved by using a modern FPGA.

Also, Tables 1 and 2 show that the performance for single IP core implementation is not impressive; however, it uses minimal resources. The small

utilization of the FPGA device and the nature of algorithm can lead to high levels of parallelism. The alignment of each pair of input sequences can be computed independently. Taking into account that large modern devices have a significant number of Block RAM memories and exploiting data independence, up to 22 parallel IP cores can operate in parallel in a single device for both alignment processes, thus achieving a considerable system-level speedup, which is more considerable in some classes of datasets, as described below.

The performance of the implemented system depends on the size and the nature of the input sequences. The Block RAM Memories used to store the input sequences are the bottleneck of the new architecture, which results in the greater input and fewer parallel IP cores, and as a result it leads into a reduction of the performance. As shown in Table 1, for the very long sequences the system needs high data retrieval from the memory. This makes the problem to become control intensive, losing the benefits of the hardware parallelism. Finally, the system was tested with very long sequences which yielded worse results vs. the software implementation; however this is not a typical input dataset as most of the sequences tested in Biology laboratories have 200-300 residues (max.) length.

4.2 MAFFT IP Core Results

The MAFFT IP core was designed on a Xilinx Virtex 5 (XC5VSX240T) FPGA. The proposed

architecture is also very demanding on the number of Block RAM memories, as for “large” datasets, the IP core uses the total amount of BRAMs whereas for “small” datasets, it utilizes about 13% of the memory. The designed system can process up to 10,000 sequences with 200 residues, each. As shown in Table 3, the design was tested with six different kinds of input sequences. The clock rate of this architecture is 135 MHz for a single IP core. Table 3 shows the run times for all the measured input sequences for a general purpose processor running original software and for the designed IP core and the perspective speedup. For the “large” datasets IP Core is 4 to 5 times faster. For the “small” datasets things are not that good but following the considerations that we made for the T-Coffee IP core, for the “small” datasets of MAFFT we can assume that for a large modern FPGA device we can have up to 15 parallel MAFFT IP cores, thus achieving speedup from 10 to 55 times vs. a high end general purpose processor.

These IP cores can be set up for different sizes of datasets, which makes reconfigurable computing preferable to VLSI due to the resulting flexibility to “tune” the design to the dataset type.

5 CONCLUSIONS

Two of the five best known algorithms for multiple sequence alignment implemented and used by the European Bioinformatics Institute (*EBI*) are the MAFFT and T-Coffee algorithms. This work presents FPGA technology-based IP cores for the T-Coffee and MAFFT algorithms. This is to the authors’ knowledge the first work in the literature in which there is an attempt to model these two algorithms in reconfigurable hardware. Experimental results show that reconfigurable technology can offer significant performance boosting, especially in cases in which the input data allows for high parallelism. Future research will focus on performance improvement of the designed IP cores by increasing the number of parallel machines. As internal memory (BRAMS) is the critical resource, storing the input sequences in external memory (DDR) can free the internal memory for more parallel machines. The hardware integration of the designed IP cores with the rest of the algorithm running in software can lead to systems that can be used by biologists.

ACKNOWLEDGEMENTS

This publication is based on work performed in the framework of the FP7 Project OSMOSIS, which is funded from the European Community’s Seventh Framework Programme (FP7/2007-2013) under grant agreement FP7-SME-222077. The authors would like to acknowledge: the contributions to the OSMOSIS Project of their colleagues in Algosystems SA, Electronic Design Ltd, Dunvegan, Politecnico di Torino, CEA, and TSI.

REFERENCES

- Thompson, J. D., Higgins, D. G., Gibson, T. J., 1994. CLUSTAL W: improving the sensitivity of progressive multiple sequence alignment through sequence weighting, position-specific gap penalties and weight matrix choice. *Nucleic Acids Research*, vol 22, pp. 4673-4690.
- Notredame, C., Higgins, D. G., Heringa, J., 2000. T-Coffee: A novel method for fast and accurate multiple sequence alignment. *Journal of Molecular Biology*, vol. 302, issue 1, pp. 205-217.
- Katoh, K., Kuma, K., Toh, H., Miyata, T., 2005. MAFFT version 5: improvement in accuracy of multiple sequence alignment. *Nucleic Acids Research*, vol 33, pp. 511-518.
- Edgar, R. C., 2004. MUSCLE: a multiple sequence alignment method with reduced time and space complexity. *BMC Bioinformatics*, 5:113.
- Do, C. B., Mahabhashyam, M. S. P., Brudno, M., Batzoglou, S., 2005. PROBCONS: Probabilistic Consistency-based Multiple Sequence Alignment. *Genome Research*, vol. 15, pp. 330-340.
- Morgenster, B., French, K., Dress, A., Werner, T, 1998. DIALIGN: Finding local similarities by multiple sequence alignment. *Bioinformatics*, vol. 14, No. 3, pp. 290-294.
- Oliver, T., Schmidt, B., Nathan, D., Clemens, R., Maskel, D., 2005. Using reconfigurable hardware to accelerate multiple sequence alignment with ClustalW. *Bioinformatics*, vol. 21, No. 16500, pp. 3431-3132.
- Lin, X., Peiheng, Z., Dongbo, B., Shengzhong, F., Ninghui, S., 2005. To accelerate Multiple Sequence Alignment using FPGAs. *High-Performance Computing in Asia-Pacific Region*, pp. 176-180.
- Boukerche, A., Correa, J. M., Melo, A. C. M. A., Jacobi, R. P., Rocha, A. F., 2007. An FPGA-based accelerator for multiple biological sequence alignment with DIALIGN. *International Conference on High Performance Computing*, pp. 71-82.
- Masuno, S., Maruyama, T., et al., 2007. An FPGA Implementation of Multiple Sequence Alignment Based on Carrillo-Lipman Method. In *Proceedings of Field Programmable Logic and Applications*, pp. 489-492.