# RADIX-2 MULTI-DIMENSIONAL TRANSPOSITION-FREE FFT ALGORITHM FOR MODERN SINGLE INSTRUCTION MULTIPLE DATA (SIMD) ARCHITECTURES

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#### ABSTRACT

A general radix-2 FFT algorithm was recently developed and implemented for Modern Single Instruction Multiple Data (SIMD) architectures. This algorithm (SIMD-FFT) was found to be faster than any scalar FFT implementation, and as well, than other FFT implementations that uses the SIMD architecture for complex 1D and 2D input data [1].

In this paper, the SIMD-FFT algorithm is extended to handle Multi-Dimensional input data; this new approach does not make use of matrix transposition. The results are compared against the FFTW for the 2D and 3D case. Overall, the SIMD-FFT was found to be faster for complex 2D input data (ranging from 82% up to 343%), and as well, for complex 3D input data (ranging from 59.5% up to 198%)

### 1. INTRODUCTION

General-purpose processors with single instruction multiple data (SIMD) capabilities can process more than one data element in a single instruction. The SIMD architecture has rapidly become a standard feature in the past few years, and it is present in most general-purpose microprocessors (Intel, AMD, Motorola, etc.).

A new general algorithm was proposed and implemented [1] to compute FFT based on SIMD operations, and recently, extended to handle multi-dimensional (M-D) input data. It must be observed that for the M-D case, memory access play an important role in the overall performance of any FFT algorithm; it is desirable to preserve the regular data access pattern, present in almost

any 1-D FFT algorithm. In [1] the Eklhund's matrix transposition algorithm [2], optimized for the SIMD architecture was used to address this problem in the 2-D case; nevertheless that approach cannot be efficiently applied for higher dimensions.

The primary features of this new procedure are: (i) preserve the architecture independent property, shown by the preceding implementation, (ii) do not make use of matrix transposition, and as well, employ regular data access at any stage of the M-D transform; and (iii) let the procedure be recursive for handling multi-dimensional FFTs.

This paper is organized as follows: in section 2 the SIMD architecture is briefly introduced; the SIMD-FFT algorithm is describe in section 3, also the new approach to handle multi-dimensional input data is explain. In section 4 computational results are shown. Conclusions are listed in section 5.

#### 2. SIMD ARCHITECTURE

The support for SIMD instructions was introduced in general-purpose processors to improve the performance of different applications (multimedia, image processing, etc). The SIMD instructions were first introduced for integer data, and, in the past three years, extended to support floating point data.

Any microprocessor with SIMD floating point capabilities allows operations over four (currently state of art) single precision floating point (32-bit each) in a single instruction. In what follows, without loss of generality, only single precision floating point (32-bits) SIMD

capabilities will be considered. Floating point SIMD (FP-SIMD) capabilities have different names among different microprocessor manufactures:

Intel: "Streaming SIMD Extensions (SSE)"

AMD: "3DNow!" Motorola: "AltiVec"

Regardless of the manufacturer, processors with FP-SIMD capabilities, use a special set of registers (128-bit long each for SSE and AltiVec, 64-bit long registers for 3DNow!) to allow math operations over four single precision floating-point numbers in a single instruction (this is true even for 3DNow!).

## 3. RADIX-2 FFT

## 3.1. Classic algorithm

The Classic R2-FFT algorithm can be found in any textbook in signal processing [2]. In the present paper it is convenient to use the matrix framework introduced in [3].

Let  $X = [X_0 X_1 ... X_{n-1}]^t$  where  $n = 2^m$ , then the radix-2 FFT of X can be expressed as [3, page 18]:

$$Y = FFT\{X\} = (\prod_{k=1}^{m} A_k) P_N X$$
 (1)

$$A_k = I_k \otimes B_{2^{m-k+l}} \tag{2}$$

$$\mathbf{B}_{2L} = \begin{bmatrix} \mathbf{I}_{L} & \mathbf{O}_{L} \\ \mathbf{I}_{L} & -\mathbf{O}_{L} \end{bmatrix} \tag{3}$$

where  $\otimes$  is the Kronecker product [3, page 7],  $I_N$  is an NxN identity matrix,  $\Omega_L = \text{diag}(1, W_{2L}, ..., W_{2L}^{L-1})$ ,  $W_L = e^{-j2\pi L}$ and  $P_N = Per(I_N)$  is the bit reversal permutation of the columns of the matrix I<sub>N</sub>. Note that the square matrix A<sub>k</sub> represents the operations perform in the k<sup>th</sup> stage of the radix-2 FFT algorithm.

## 3.2. SIMD approach: Radix-2 SIMD-FFT

The radix-2 SIMD-FFT algorithm modifies the operations performed in the first and second stage of the standard FFT; this can be expressed as follows:

$$Y = (\prod_{k=3}^{m} A_k) R_{22,N} T_{2,N} R_{21,N} S_N R_{12,N} R_{11,N} T_{1,N} S_N X$$
 (4)

$$Y = (\prod_{k=3}^{m} A_k) R_{22,N} T_{2,N} R_{21,N} S_N R_{12,N} R_{11,N} T_{1,N} S_N X$$

$$S_N = \begin{bmatrix} I_{N/2} & I_{N/2} \\ I_{N/2} & -I_{N/2} \end{bmatrix}$$
(5)

$$T_{1,N} = \begin{bmatrix} I_{3N/4} & 0 \\ 0 & -jI_{N/4} \end{bmatrix}$$
 (6)

$$\mathbf{T}_{2,N} = \begin{bmatrix} \mathbf{I}_{N/4} & 0 & 0 & 0 \\ 0 & \mathbf{V}_1 & 0 & 0 \\ 0 & 0 & \mathbf{I}_{N/4} & 0 \\ 0 & 0 & 0 & \mathbf{V}_2 \end{bmatrix}$$
 (7)

where  $R_{11,N} = Mix(I_2 \otimes P_{N/2})$ and  $R_{12,N} = Mix(I_2 \otimes Mix(I_2 \otimes P_{N/4})); \ also \ R_{21,N} = \ I_{N/4} \otimes P_4 \ and$  $R_{22} = R_{11}$ . The matrix operation Mix(H) is a permutation of the square NxN matrix H; let H be expressed as  $H = [H_1, H_2, ..., H_N]^T$ , where H<sub>k</sub> is the k<sup>th</sup> row of H, then  $Mix(H) = [H_1, H_{N/2+1}, H_2, H_{N/2+2}, ..., H_{N/2}, H_N].$ 

Matrices  $V_1$  and  $V_2$  (equation (7)) are diagonal, where  $V_1 = diag(1, W_8^1, ..., 1, W_8^1)$ . The elements of  $V_1$  are composed of two factors, and each is repeated N/8 times. Also  $V_2 = diag(W_8^2, W_8^3, ..., W_8^2, W_8^3)$  has a similar structure. These matrices impose a restriction: the input data size must be greater or equal than eight.

Any microprocessor with FP-SIMD capabilities can perform the operation defined by the matrix  $S_N$  (equations (5)) using SIMD operations and additions/subtractions in a single instruction). Also the operations defined by T<sub>1,N</sub> and T<sub>2,N</sub> can be easily performed in SIMD fashion.

It must be noted that no assumption about the input data type (real or complex) was made; furthermore, operations define by  $R_{22,N}T_{2,N}R_{21,N}S_N$  (second stage of the radix-2 SIMD-FFT) can be made in place.

## 3.3 M-Dimensional extension

In [1] it was shown that this algorithm leaded to a very efficient implementation for the 1D case: speed improvement ranged from 1.95 up to 4.72 (times faster) for complex input data, when compared to the scalar version of the FFTW [4]; it also outperforms other FFT implementations that take advantage of the SIMD architecture [5,6]. For the 2D case, which used the Eklundh algorithm for matrix transposition (optimized for the SIMD architecture), the speed improvement ranged from 1.68 up to 4.43 (times faster) for complex input data when compare to the scalar version of the FFTW.

For the general M-D input data case, a special, yet simple approach was developed. This is explain, without loss of generality for the 3-D case; lets assume a 3D data set is organized in memory as follows: for a given plane (Z axis) elements are arranged in row-wise fashion; also,

planes are stored one after the other (see fig. 1.a); in other words all the elements are store in a 1D vector.

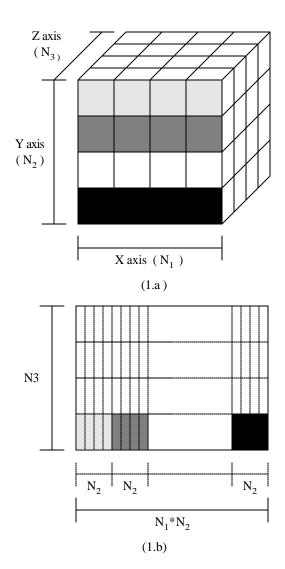


Figure 1 The computation of all FFTs along the Z axis in (a) is equivalent to the computation of all FFTs along columns in (b).

Hence to compute the 3D DFT, we could compute the 2D FFT across planes, and then compute a 1D FFT through the Z axis; At this point we can consider our 3D data set (with dimension  $N_1xN_2xN_3$ ) as a 2D data set (with dimensions  $N_1*N_2xN_3$ ); and compute FFT across the columns of the equivalent matrix. This can be expressed using equation (1) as follows:

$$Y = FFT_{Z-axis}\{X\} = (\prod_{k=1}^{m3} A_k) P_{N_3} X_{N_3 \times N_1 \times N_2}$$
 (8)

where  $P_{N3}$  and  $A_k$  are defined as in section 3.1; also  $N_3=2^{m3}$ . We should notice that if a SIMD architecture

could handle  $N_1*N_2$  elements at a time we are back in the 1-D case. There is no such an architecture, but we can implement this idea with the current SIMD technology: we repeat the same operation  $N_1*N_2/4$  times; if we proceed following this approach, now all data accesses are regular and continuous in memory; also we note that there is no need for transpose the data set. Finally we notice that we need to generate the twiddle factors using a method compatible with this idea: repeat the same twiddle factor four times.

A pseudo algorithm to carry out the present approach for the 3-D case can be summarize as follows:

- Compute N<sub>3</sub>\*N<sub>2</sub> 1-D FFTs.
- Compute FFTs across columns of N<sub>3</sub> matrices of size N<sub>2</sub>xN<sub>1</sub> (each operation is repeated N<sub>1</sub>/4 times).
- Compute FFTs across columns of 1 matrix of size N<sub>3</sub>xN<sub>2</sub>\*N<sub>1</sub> (each operation is repeated N<sub>2</sub>\*N<sub>1</sub>/4 times).

It should be noted that memory management is a real issue for the M-D case; In particular for the 3D case, a complex floating point cube of size N, needs 8\*N³ bytes of memory (about 132M for a cube of 256 elements per dimension); memory management and organization of the input/output data set should be considered as part of any M-D FFT algorithm.

## 4. COMPUTATIONAL RESULTS

The extension to the SIMD-FFT algorithm was implemented in C along with inline assembly instructions, using Linux (kernel 2.4.13) as OS on an Intel architecture (to allow portability only PIII SSE instruction set was allowed) and on a Motorola PowerPC (PPC) architecture; its performance was compared against the FFTW (version 2.1.3) [4]. The compilation options for the FFTW included the *-enable-i386-hacks* and *-enable-float* flags.

This new algorithm was fully tested on a Pentium4 (P4) running at 1.4 GHz, with 512M of RAM; its CPU clock was measured using the time-stamp counter [7], and used to calculate the time performance for all implementations.

The procedure used to compare the time performance between all implementations was to perform the direct Fourier transform of complex-input data, for length from 2<sup>5</sup> up to 2<sup>10</sup> elements in the 2D case and for length from 2<sup>4</sup> up to 2<sup>8</sup> elements in the 3D. The transforms were performed repeatedly (10<sup>3</sup> iterations for both 2D and 3D respectively) for a particular size, and repeated 10 times. Also, any one-time initialization cost is not included in the measurements. Results (best case) are shown in tables I and II (also fig. 2 and 3) for the complex case, 2D and 3D respectively.

SIZE	2D FFT MEAN TIME (MILISECONDS)		
PER	LINUX INTEL		
DIM	SIMD-FFT ([1])	SIMD-FFT	FFTW
		(Transposition-free)	
$2^{5}$	0.041	0.029	0.070
$2^{6}$	0.168	0.131	0.317
$2^{7}$	0.937	1.755	1.712
$2^{8}$	5.147	8.816	20.611
29	22.436	42.012	99.517
$2^{10}$	115.350	197.842	426.015

Table 1. Time performance for the complex 2D input data. The mean value (ms) for  $10^3$  iterations is shown.

SIZE	3D FFT MEAN TIME (MILISECONDS)		
PER	LINUX INTEL		
DIM	SIMD-FFT	FFTW	
$2^{4}$	0.157	0.341	
$2^{5}$	3.237	5.165	
$2^{6}$	36.980	107.647	
$2^{7}$	400.587	1141.518	
$2^{8}$	4352.827	13006.450	

Table 2. Time performance for the complex 3D input data. The mean value (ms) for  $10^3$  iterations is shown.

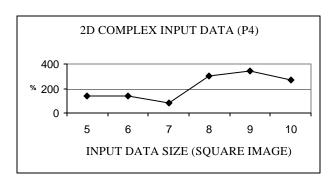


Figure 2 2D SIMD-FFT performance improvements over the scalar 2D FFTW is shown for the Intel architecture.

Table 1 compares the time performance for the 2-D case between the 2-D SIMD-FFT [1], the new transposition free approach and the scalar FFTW for complex input data. It must be noted that for small images the new approach (transposition-free) is more efficient than the previous implementation of the SIMD-FFT; if we combine both approach, the 2D SIMD-FFT outperforms the FFTW ranging from 89% up to 343%; the percentage factor is:  $100*(T_{FFTW}/T_{SIMD-FFT}-1)$ . Also, for the complex 3D case, the SIMD-FFT outperforms the FFTW's scalar implementation ranging from 59.5% up to 198% (see table 2 and figure 3); in this case, to compute all FFTs across planes, the final implementation combine both methods: the one used in [1] and the transposition-free approach.

#### 5. CONCLUSIONS

An extension to the SIMD-FFT algorithm was derive and implemented for NDimension input data set. The time performance shows that this approach is well suited for small image and very large images (2D case); these results improve results in [1]. Also for the 3D case, the time performance was found to be better than the performance of other general M-D FFT implementations [4].

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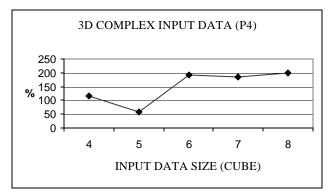


Figure 3 3D SIMD-FFT performance improvements over the scalar 3D FFTW is shown for the Intel architecture.

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