# An Optimum Design of FFT Multi-Digit Multiplier and Its VLSI Implementation

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## **Abstract**

We designed a VLSI chip of FFT multiplier based on simple Cooly-Tukey FFT using a floating-point representation with optimal data length based on an experimental error analysis. The VLSI implementation using HITACHI CMOS  $0.18\,\mu$  m technology can perform multiplication of  $2^5$  to  $2^{13}$ digit hexadecimal numbers 19.7 to 34.3 times (25.7 times in average) faster than software FFT multiplier at an area cost of 9.05mm2 . The hardware FFT multiplier is 35.7 times faster than the software FFT multiplier for multiplication of  $2^{21}$  digit hexadecimal numbers. Advantage of hardware FFT multiplier over software will increase when more sophisticated FFT architectures are applied to the multiplier.

**Keyword:** FFT, multi-digit multiplier, VLSI, error analysis

## **1 Introduction**

Multi-digit arithmetic is used by various applications in recent years, including numerical calculation [1], high-performance primality testing [2], chaos arithmetic [3], and cryptography. Several methods for fast multi-digit multiplication have been proposed, such as Karatsuba method [4], Toom-Cook method, and FFT multiplication, the computational complexities of which are given by  $O(m^{1.585})$ ,  $O(m^{1.465})$ , and  $O(m \log m \log \log m)$ , respectively, where *m* stands for number of digits. Here we focus our attention to the FFT multiplication.

Hardware implementation of multi-digit multiplication algorithms is effective for realizing high performance arithmetic. However, VLSI implementation of Karatsuba method, for example, could only be used for multi-digit multiplication. On the other hand, VLSI implementation of FFT multiplication can be realized by using FFT hardware [5, 6] as its main component which is used in many application areas as DSP. This implies that hardware FFT multiplier can easily be retargeted to many applications.

In this paper we describe an optimum VLSI design of FFT multiplier with high performance at minimum cost. For this purpose we perform an experimental

of performance and area cost by comparing with software implementations of multi-digit multiplication. This paper differs from previous paper [7] in several points: details of hardware modules, discus-

sions on using existing floating-point multipliers, and considerations of applying FFT processors to multiplication are presented. In addition, comparisons with software were made by using faster processor.

error analysis to obtain a data representation with minimum bit length. We evaluate the design in terms

Section 2 briefly explains FFT multiplication algorithms. Section 3 presents a hardware structure for FFT multiplication. Section 4 describes an optimization of the hardware FFT multiplier based on an experimental error analysis. In Section 5 results are presented and discussions are given. We present some concluding remarks in Section 6.

## **2 FFT Multiplication Algorithm**

Let *r* be the radix, and *m* be the number of digits such that  $2m = 2<sup>k</sup>$  for some nonnegative integer *k*. We represent two integers  $a = (a_{m-1} \dots a_0)_r$ and  $b = (b_{m-1} \ldots b_0)_r$  by  $2m$  dimension complex vectors



Figure 1: Structure of FFT multiplier.

with the imaginary parts of all zeros,  $u =$  $(0 \dots 0a_{m-1} \dots a_0)_r$  and  $v = (0 \dots 0b_{m-1} \dots b_0)_r$ . Let the product of *u* and *v* be  $h = u \cdot v = (c_{2m-1} \dots c_0)_r, F(\cdot)$  be an FFT, and  $F^{-1}(\cdot)$  be an inverse FFT. Then we have

$$
h = F^{-1} (F (u) \otimes F (v)) / 2m,
$$
 (1)

where ⊗ denotes multiplying two arrays to obtain an array each element of which is the product of the elements with the same index. In addition, we need to round each digit to the nearest integer, adjust it to be within the range of radix  $r$ , determine the carry received from the lower digit, and send the carry to the upper digit if necessary.

## **3 Design of FFT Multiplier**

Fig. 1 outlines the structure of the FFT multiplier we designed. The solid and broken lines mean the data and operation flows, respectively. We employ floatingpoint as data representation. All data-path modules share a memory. Each module repeats fetching data from the memory, calculating them, and writing back the results. The following subsections explain the circuit construction of each module.

#### **3.1 complex multiplier**

When two complex numbers,  $s_r + s_i i$  and  $t_r + t_i i$  are



Figure 2: Structure of complex multiplier. Figure 4: Structure of inv-butterfly module.



Figure 3: Structure of butterfly module.

given, this module performs their multiplication based on Eq. (2).

$$
p_r + p_i i = (s_r + s_i i)(t_r + t_i i)
$$
  
=  $s_r t_r$ .  $s_i t_i + ((s_r + s_i)(t_r + t_i) - (s_r t_r + s_i t_i))i$ . (2)

Because the cost of adder is lower than that of multiplier, the number of multiplications is decreased at a sacriflce of increasing the number of addsubtract operations according to Eq. (2). The resulting module structure is shown in Fig. 2, where fpmul and fpaddsub submodules perform floatingpoint multiplication and add-subtract, respectively. The buffer module is used for synchronization.

#### **3.2 butterfly and inv-butterfly modules**

The butterfly and inv-butterfly modules are used for FFT forward and inverse transforms, respectively. Their structures depend on the type of FFT algorithm being used. Here we employ the Cooley-Tukey algorithm [8] for simplicity.

The butterfly operation for Cooley-Tukey FFT is given by  $X = x + yW$ ,  $Y = x - yW$ , where *W* represents one of the primitive 2*m*-th roots of unity. The module structure is shown in Fig. 3.

The inverse butterfly operation is given by  $X' = x' + y'$ *y'*,  $Y' = (x' - y')W$ . The module is structured similarly and is shown in Fig. 4.





Figure 5: Structure of rounder-carrier module.

## **3.3 scaler module**

After the inverse butterfly, each digit is divided by 2*m*. For this operation only the exponent part of the result needs to be subtracted by *k* because  $2m = 2^k$ , where  $k$  is an integer. This operation is called scaling. Due to the symmetric characteristics of FFT, the values fed into the scaler should be real numbers, although finite small errors would appear in their imaginary parts which are allowed to be neglected. The scaler module is thus comprised by a subtracter of the exponent bit length.

## **3.4 rounder-carrier module**

This module rounds each digit of a real number to the nearest integer and adjusts it within the range of radix  $r$ . The rounding is correct only if the absolute error is within  $\pm$  0.5.

Fig. 5 shows the structure of the rounder-carrier module. The module consists of fpaddsub and carry calc submodules. The fpaddsub adds the digit with a carry from the lower digit, rounds the results, and determines the carry to the upper digit. The carry calc submodule consists of a multiplexer and an adder for rounding.

## **3.5 memory module**

The data storage area required for multi-digit arithmetics is very large. If the whole storage were implemented on a single chip, the area would become huge. As a solution to this, we store the whole data in an external large-scale off-chip memory device and carry out the arithmetic operations in a cache. The memory module in Fig. 1 behaves as a cache which stores only a part of the data. To avoid structural hazard caused by pipelining, the cache should have two data ports each for reading and writing the data. The values of *W* are calculated and written in a look up table in advance, which is also included in this memory module.

## **3.6 controller**

This module controls the data-path of the multiplier by sending control signals to submodules at appropriate times.

## **4 Optimum Data Representation**

We employ floating-point as the data representation. Because floating-point arithmetic circuits tend to be very large we minimize the bit length of floating-point data representation required for performing correct FFT multiplication.

The minimum length of the exponent part can simply be determined by making sure that overflow does not occur during the operation. On the other hand, the minimum length of the fraction part must be determined based on the required minimum precision which is obtained through error analysis. An error analysis of FFT multiplication was performed by Henrici [9] in the past. He showed that to obtain correct products through FFT multiplication, the following inequality must be satisfled:

$$
\mathcal{E}_M \le 1/192m^2(2\log_2 m + 7)r^2,\tag{3}
$$

where  $r$ ,  $m$ , and  $\epsilon$ <sub>M</sub> are the radix, the number of digits, and the machine epsilon, respectively.

On the other hand, an observation indicated that Henrici's analysis was based on a worst case scenario and the condition could be more relaxed in actual situation [10]. The observation implies that the maximum error occurs when multiplying the maximum values represented by *m* digits. In the following an experiment to verify the observation is described. The radix  $r = 16$  is used hereafter.

We measured errors produced by FFT multiplica-

tion  $u = (0 \dots 0 \overbrace{a \dots a}^{n})_{16}$  and  $v = (0 \dots 0 \overbrace{b \dots b}^{n})_{16}$ , when varying *a* and *b* from 0 to F. The Cooley-Tukey algorithm and 64-bit floating-point data representation such as IEEE754 were used in the experiment. The result is shown in Fig. 6 for  $m = 1024$ and 2048, where the vertical axis represents absolute errors associated with  $u \cdot v$ . It was thus verified that the maximum error occurs when multiplying the maximum values represented by *m* digits. A similar result was obtained for *m* = 4096 and 8192. *m m*  $(0...0 b...b)$ *m m*



Figure 6: Errors in multiplying  $(0^m a^m)_{16}$  and  $(0^m b^m)_{16}$  using FFT.

Based on the above experimental error analysis, we defined a floating-point representation with variablelength exponent and fraction parts, and carried out a numerical calculation to obtain the least bit lengths required for performing correct FFT multiplication. The result is shown in Fig. 7, where horizontal axis represents the base 2 logarithm of number of digits *m*, and the points marked by  $+$  and  $\times$  represent the least length of the exponent and fraction parts, respectively. The solid line represents a linear function best fit to the experimental data by the leastmean square method. Note that the fraction length (the broken line in the figure) obtained from the inequality (3) is much longer than the experimentally obtained one. Also note Fig. 7 implies that if 64-bit floating-point data representation were used, FFT multiplication of up to 230 digits could be executed.



Figure 7: Fraction and exponent bit lengths required for multiplying two multi-digit numbers vs. the number of digits  $(r = 16)$ .

## **5 Implementation Results and Discussions**

We designed an FFT multiplier using an optimal data length based on the results obtained in the previous section, and evaluated the area and performance of the VLSI implementation. We described the design in Verilog-HDL and performed a logic synthesis of the descriptions using Design Compiler (Synopsis Inc.,ver. 2003.6-SP1). For the synthesis we used the CMOS 0.18μm technology cell library developed by VDEC (VLSI Design and Education Center) [11] based on Hitachi's speciflcations. We gave a delayoptimization restriction to the Design Compiler.

We evaluated the FFT multiplier with respect to the total area and critical path delay of the synthesized logic for  $m = 2^5$  to  $2^{13}$ . The controller's area was excluded in the evaluation because it did not depend on bit length of the data representation and in fact was very small compared to other modules. For the memory module (cache) we allocated 8 entries each of which can hold data used by one butterfly operation. The result is shown in Fig. 8, where the right and left vertical axes represent the total area and critical path delay of the synthesized logic, respectively. For  $m = 2^{13}$ , the multiplier with the optimum data representation (sign bit, 7-bit exponent, and 27-bit fraction) was found to be realized with the total area of 6.55mm2 and critical path delay of 7.63ns. We also evaluated FFT multiplier with 64-bit data representation (sign bit, exponent:11-bit, fraction:52-bit), and found that total area and critical path delay were 16.0mm2 and 10.3ns, respectively. Thus for  $m = 2^{13}$  we can reduce the total



Figure 8: Critical path delay and total area of FFT multiplier vs. number of digits ( $r = 16$ ).

Table 1: Area and critical path delay of the optimally pipelined FFT multiplier (*m* = 213).



area by 59% and critical path delay by 26% using the optimum data representation.

We can replace floating-point multipliers used in the described FFT multiplier by alternatives [12, 13, 14, 15]. In that case, using an optimum data length based on the proposed error analysis will also lead to reducing the total area and critical path delay.

The FFT multiplier described so far was not optimally pipelined. An optimum version of pipelined FFT multiplier for  $m = 2^{13}$  was designed as follows. Firstly, the critical path which exists in Wallace tree multiplier [16] was divided into several stages considering the area and performance trade-off. After that, the amounts of critical paths among pipeline stages was made as even as possible. The implementation result is summarized in Table 1. The maximum path delay was thus reduced to 1.89ns with the area cost of 9.05mm2 .

The pipeline latencies of the resulted modules are summarized in Table 2, where *T*butterfly, *T*cmul,  $T_{\rm scl}$ , and  $T_{\rm rc}$  represent pipeline latencies of (inv-) butterfly, complex multiplier, scaler, and roundercarrier modules, respectively. Number of clocks required for an FFT multiplication is given by

$$
Tfftmul = 3(Tbutterfly + m - 1)log2m + (2Trc + 7)m
$$

$$
+ (3Tbutterfly + Tcmul + Tscl - Trc - 3).
$$

$$
\tag{4}
$$

Requiring 541,563 clocks for an FFT multiplication of 213 digit numbers, the execution time is estimated to be 1.02ms (541,563×1.89ns).

Table 2: Latency of FFT multiplier modules.

	$\tilde{}$	ມບ⊥	$\mathbf{v}$
Latency $\cdot$			

Table 3: Comparison of FFT multiplication performance of software and hardware implementations.



We compared the performance of hardware and software implementations of FFT multiplier for  $m \leq$ 213 . We used FFTW 3.0.1 for software FFT, Pentium 4 1.7GHz CPU with the same design rule as our hardware implementation, FreeBSD 5.4 OS, and gcc 3.4.2 compiler. (We refer to the software implementation as FFTW multiplier hereafter.) The maximum path delay employed for the comparison was 1.89ns for all digits. The result is shown in Table 3.

The performance of the hardware FFT multiplier was found to be 19.7 to 34.3 (25.7 in average) times better than FFTW multiplier. The reason that the performance ratio varies depending on digits is that FFTW is tuned to operate best for 1,000 to 10,000 samples [17].

We also compared the performance of FFTW multiplier and a software implementation of Karatsuba method. We used a multi-digit arithmetic software library called exflib [18] which implements Karatsuba method. The result is that FFTW multiplier was faster than exflib for  $m \leq 2^{21}$ . At  $m = 2^{21}$ the execution time of FFTW multiplier was 13.9s.

Here we consider hardware FFT multiplier at  $m = 2^{21}$ . By extrapolating the linear functions in Fig. 7 to  $m = 2^{21}$ we have 9 and 40 bits for the minimum exponent and fraction parts, respectively, taking the deviation into account. The pipelined version of FFT multiplier with the optimum data representation obtained as above yields a critical path delay of 1.96ns, leading to 0.39s FFT multiplication at an area cost of 16.1mm2. From the result, it is found that hardware FFT multiplier is 35.7 times faster than FFTW multiplier at  $m = 2^{21}$ .

Hardware implementation of Karatsuba method would be an alternative for  $m \geq 2^{21}$ . However,

Karatsuba method applies only to multi-digit multiplication. A multi-digit multiplier using FFT hardware has an advantage that the FFT module can be utilized for various applications.

In this paper, we designed a simple FFT hardware of Cooly-Tukey FFT. However, there are many FFT processors implemented so far which have high performance at low cost by applying following features: a memory architecture to avoid memory conflict in mixed-radix (MR) algorithm [5], multipath pipeline architecture to achieve high-throughput rate [6], and so on. By applying these features, we could design an FFT multiplier with high performance. However, these processors employ data representations for DSP use. For example, FFT processors described in [5] and [6] employ 16-bit block floating-point and 10bit flxed-point data representations, respectively. The data representations limit FFT multiplication to small digits. Thus, these FFT processors in the original can not be applied to multiplying largedigit integers. They could be applied to multiplication of large-digit integers if the accuracy required by FFT multiplication is guaranteed by using the proposed error analysis.

#### **6 Conclusion**

We described a VLSI design of FFT multiplier with floating-point number representation the bit length of which was minimized based on an experimental error analysis. Using HITACHI CMOS  $0.18 \mu$  m technology cell library for logic synthesis the performance of the hardware FFT multiplier based on simple Cooly-Tukey FFT was found to be 19.7 to 34.3 (25.7 in average) times better than software FFTW multiplier when multiplying *m*-digit hexadecimal numbers,  $m \leq$  $2^{13}$ , with an area cost of  $9.05$ mm<sup>2</sup>. The hardware FFT multiplier was 35.7 times faster than software FFTW multiplier of 221 digit hexadecimal numbers where FFTW multiplier exceeds Karatsuba method in performance, with an area cost of 16.1mm2 . A multidigit multiplier using FFT hardware has an advantage over hardware Karatsuba multiplier in that the FFT component can be utilized for various applications. Advantage of hardware FFT multiplier over software will increase when more sophisticated FFT architectures are applied to the multiplier. The quantitative evaluation belongs to future work.

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