CFNTT: Scalable Radix-2/4 NTT Multiplication Architecture with an Efficient Conflict-free Memory Mapping Scheme

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Abstract. Number theoretic transform (NTT) can be utilized to speed up polynomial multiplication, which is the critical computation bottleneck in a lot of cryptographic algorithms like lattice-based post-quantum cryptography (PQC) and homomorphic encryption (HE). The NTT hardware architecture needs to support diverse security parameters and meet resource constraints on different computing platforms. Thus flexibility and Area-Time Product (ATP) become two crucial metrics in NTT hardware design. The flexibility of NTT in terms of different vector sizes and moduli can be obtained directly. Whereas the varying strides in memory access of in-place NTT render the configuration for different radix and number of parallel butterfly units a tough problem. This paper proposes an efficient conflict-free memory mapping scheme which supports the configuration for both multiple parallel butterfly units and arbitrary radix of NTT. Compared to other approaches, this scheme owns a wider application and facilitates the parallelization of non-radix-2 NTT hardware design. Based on this scheme, we propose a scalable radix-2 and radix-4 NTT multiplication architecture by algorithm-hardware co-design. A versatile schedule method is leveraged to reduce the number of modular additions/subtractions and modular multiplications of radix-4 butterfly unit by 20% and 33%, respectively. To avoid the bit-reversed cost and save memory footprint in arbitrary radix NTT/INTT, we put forward a general method by rearranging the loop structure and reusing the twiddle factors. The architecture-level optimization is achieved by excavating the symmetric operators in radix-4 butterfly unit, which saves almost 50% hardware resources compared to a straightforward implementation. Through experimental results and theoretical analysis, we point out that the radix-4 NTT with the same number of parallel butterfly units outperforms the radix-2 NTT in terms of area-time performance in the interleaved memory system. This advantage is enlarged when increasing the number of parallel butterfly units. For example, when processing 1024 14-bit points NTT with 8 parallel butterfly units, the ATP of radix-4 NTT FPGA core achieves improvement by approximately 51.6%.

Keywords: number theoretic transform, polynomial multiplication, algorithm-hardware co-design, radix-4, conflict-free memory mapping scheme

1 Introduction

In recent years, both industrial and academic community have sparked a boom in the research of post-quantum cryptography and homomorphism encryption. Since the Shor algorithm renders the traditional cryptosystems, like Rivest Shamir Adleman (RSA) and Elliptic Curve Cryptography (ECC), to be cracked by quantum computer within polynomial time [Sho94], the National Institute of Standards and Technology (NIST) has initiated a contest to solicit anti-quantum cryptographic algorithms around the world. In July 2020, 7 finalists and the 8 alternate candidates are announced in the third round and lattice-based schemes account for 5/7 of them. Lattice-based cryptography provides both solid security and hardware friendly way to build anti-quantum cryptosystems [MAA+20]. It also offers

other advanced applications, such as fully homomorphic encryption [Gen09] and zero knowledge proof [LNS20]. Hommorphic encryption algorithm enables the computation process of data in the form of ciphertext, further ensuring the privacy of server-side data. The polynomial multiplication is the well-known computational bottleneck in lattice-based schemes, while leveraging number theoretic transform can reduce its complexity from $\mathcal{O}(N^2)$ to $\mathcal{O}(N \log N)$ [Nic71]. As a result, works focused on the design of NTT hardware accelerator have been intensively carried out.

Although the NTT algorithm applied in lattice-based PQC and HE is slightly different, the overall hardware architecture has a lot of similarity. It is interesting to propose a scalable NTT multiplication architecture as a building block for these schemes [CHK+21] [MKO+20a]. Besides, some resource constrained scenarios focus on compact and energy-efficient design like IoT, while others pursue high throughput and better performance like 5G [XHY+20]. To meet these diverse requirements, the flexibility and Area-Time Product become two crucial metrics in NTT hardware design.

Related work. Plenty of works have developed optimization techniques for radix-2 NTT hardware architecture. But the design of radix-4 NTT hardware core is still rare. With regard to the algorithm level optimization, [POG15] and [ZYC+20] demonstrate the iterative radix-2 NTT algorithm free from the pre-processing and post-processing. It reduces the computation complexity by merging the $2N$-th primitive roots of unity and scale factor into every stage. [XL21] and [POG15] avoid the bit-reversed cost by changing the loop structure of decimation in time (DIT) and decimation in frequency (DIF) radix-2 NTT. This method is also adopted by the reference software implementation of Kyber published by NIST. [ACC+21] and [CHK+21] introduce various NTT extension algorithms by applying versatile FFT tricks, enabling the software implementation of polynomial multiplication on NTT unfriendly rings. In terms of architecture level design, unlike the popular pipelined FFT architecture, such as single delay feedback (SDF) and multiple delay commutator (MDC) [TCH19] [HT96], current NTT core mainly adopts memory-based architecture allowing for trade-off between area and performance. [CMV+15] proposes a high-speed pipelined polynomial multiplication architecture based on constant geometry radix-2 NTT. This paper points out the temporal conflicts in pipelined architecture. [FL19] presents a HE integer multiplier utilizing the negative wrapped convolution and Ping-pong radix-2 FFT algorithm. Compared to in-place NTT architecture, the aforementioned two types have simpler memory access pattern at the price of double memory overheads. Actually, [GGMG13] and [SYJ84] indicate that radix-4 FFT architecture has advantages in high-throughput-demanding applications.

Conflict-free memory mapping scheme is a key component for parallel NTT hardware architecture. However, to our best knowledge, efficient and general memory mapping scheme for arbitrary radix NTT with parallel butterfly units is still in lack. [Joh92] presents a conflict-free address mapping method for arbitrary radix FFT. [LSW01] and [WHEW14] design a dedicated radix-2 FFT and radix-16 NTT architecture based on this method, respectively. But it is identified in [XMX17] and [ZYC+20] that this scheme cannot be applied into the case when placing multiple parallel butterfly units into every stage. [ZYC+20] handles this problem by changing the last loop of NTT algorithm, but it is only suitable for radix-2 NTT. [XMX17] [TJS03] presents a memory mapping approach in terms of radix-2^k constant geometry FFT configured with several parallel butterfly units. The vector radix-2 NTT core configured with 32 parallel butterfly units is proposed in [XHY+20]. The memory access pattern is implemented by six types of permutation networks, which has complex control mode and consumes more hardware resources. [RV08] puts forward an address mapping scheme supporting arbitrary radix in-place FFT and parallel butterfly units. But this scheme requires a lot of banks positioning at every stage as read-write buffer. Memory mapping approach proposed in [RMD+15] will vary with

stages, increasing the complexity of pipelined design. A constant geometry radix-2 NTT architecture with only two parallel butterfly units is demonstrated in [BUC19]. [FLX20] also proposes a parallel Stockham NTT hardware design. [XWXY17] derives an address mapping approach for parallel arbitrary radix MDC-memory-based FFT architecture. However, the aforementioned three cases consume double memory overheads. [MKÖ+20b] and [RVM+14] utilize a single RAM to construct the parallel radix-2 NTT address mapping scheme without consideration for other radix.

Contribution. In general, our contributions are summarized as follows:

1. We provide a detailed derivation for bit-reversed-free radix-4 NTT/INTT algorithm with low complexity over polynomial rings. The proposed algorithm eliminates the pre-processing and post-processing by merging $2N$-th primitive roots of unity and scale factors into every stage of radix-4 NTT/INTT, which consumes minimal number of modular multiplications $N \log_4 N$. To avoid the bit-reversed cost and reduce the memory footprint in arbitrary radix NTT/INTT, we put forward a general method by rearranging the loop structure and reusing the twiddle factors.

2. A scalable radix-2 and radix-4 NTT multiplication architecture is proposed in this paper. We adopt a versatile schedule method to reduce the number of modular additions/subtractions and multiplications in radix-4 butterfly unit by 20% and 30%, respectively. By excavating and reusing the symmetric operators in radix-4 butterfly unit, we saves almost 50% area overheads compared to a straightforward implementation. Through experimental results and theoretical analysis, we point out that the radix-4 NTT has an advantage over radix-2 NTT in terms of area-time performance in the interleaved memory system, which is enlarged when increasing the number of parallel butterfly units. The ATP of radix-4 NTT FPGA core with 8 parallel butterfly units achieves improvement by approximately 51.6% when processing 1024 14-bit points NTT.

3. The efficient memory access of in-place NTT is guaranteed by the proposed conflict-free mapping scheme, which supports the configuration for multiple parallel butterfly units and arbitrary radix. This scheme avoids introducing queues and pipeline stalls, thus enabling the 100% utilization of pipelined NTT architecture. It also paves the way for other non-radix-2 NTT hardware design. In contrast to other approaches, this scheme has a wider application and can be implemented by standard logic gates like bit-wise XORs and Shifts.

2 Preliminaries

2.1 NTT-based Multiplication Algorithm

The traditional Fast Fourier Transform (FFT) applied in digital signal process is defined on the complex field $\mathbb{C}$, which reduces the computation complexity of Discrete Fourier Transform (DFT) from $\mathcal{O}(N^2)$ to $\mathcal{O}(N \log N)$. The Number Theoretical Transform (NTT) can be regarded as DFT defined on finite field $\mathbb{Z}_q$, so that the vector multiplication can be computed without loss accuracy. The Inverse Number Theoretical Transform (INTT) can be obtained by replacing the twiddle factor ω of NTT with its inverse element ω^{-1} followed by multiplying the scale factor N^{-1}. The concrete formula is described as belows:

[Nic71]:

$$A_i = NTT(a_i) = \sum_{j=0}^{N-1} a_j \omega_N^{ij} \bmod q \quad i = 0, 1, ..., N-1$$
$$a_j = INTT(A_j) = -\frac{1}{N} \sum_{i=0}^{N-1} A_i \omega_N^{-ij} \bmod q \quad j = 0, 1, ..., N-1 \tag{1}$$

NTT multiplication on finite field. In general, the prime modulus q needs to satisfy $q \equiv 1 \pmod{N}$, which ensures the existence of N-th primitive roots of unity ω. N is a power of 2. As a result, the multiplication of two N-term polynomials on finite field can be performed as equation 2, where the length of vector $\boldsymbol{a}$ and $\boldsymbol{b}$ is N, the zeropadding operation is to double the length of input vector by appending N zero at the end. Therefore, the length of vector $\boldsymbol{c}$ becomes $2N$.

$$\boldsymbol{c} = INTT(NTT(zeropadding(\boldsymbol{a})) \cdot NTT(zeropadding(\boldsymbol{b}))) \tag{2}$$

NTT multiplication over the ring. In lattice-based PQC algorithm, the polynomial multiplication over the ring $\mathbb{Z}_q[x]/\langle f(x)\rangle$ needs extra modular reduction with irreducible polynomial $f(x)$. But if $f(x) = x^N + 1$, we can use the well-known negative wrapped convolution (NWC) method to avoid doubling efforts and extra modular reduction. The NWC method can be expressed as equation 3, where ϕ is $2N$-th roots of unity and $q \equiv 1 \pmod{2N}$ at this time.

$$\begin{aligned} \text{Pre-processing}: \ & \overline{a_i} = a_i \cdot \phi_{2N}^i \quad \overline{b_i} = b_i \cdot \phi_{2N}^i \\ \text{Multiplication}: \ & \overline{c_i} = INTT(NTT(\overline{a_i}) \cdot NTT(\overline{b_i})) \\ \text{Post-processing}: \ & c_i = \overline{c_i} \cdot \phi_{2N}^{-i} \end{aligned} \tag{3}$$

The so-called pre-processing and post-processing can be eliminated by merging factors ϕ_{2N}^i (ϕ_{2N}^{-i}) into every stages of NTT [ZYC+20]. While the bit-reversed operation can be further removed by rearranging the loop structure [XL21]. The complete bit-reversed-free radix-2 iterative NTT with low complexity is presented in algorithm 1, where the twiddle factors ω can be precomputed and stored in the ROM. [ACC+21] and [CHK+21] introduce a series of NTT extension algorithms, e.g., mixed-radix, Good's trick and multiple modulus NTT, which allows the NTT multiplication to be performed on NTT-unfriendly rings. However, these novel algorithms are only implemented on the software platform Cortex-M4

Algorithm 1 Radix-2 Bit-reversed-free DIT NTT Algorithm

Input: $\boldsymbol{a}$ denotes a vector of length N, q is modulus and ϕ_{2N} is $2N$-th primitive roots of unity.
Output: $\boldsymbol{A} = DIT\_NTT(\boldsymbol{a})$

```
r ← 1
for p = log2 N − 1 to 0 do
    J ← 2^p
    ω_m ← φ_2N^{N/(2J)}
    for k = 0 to N/(2J) − 1 do
        ω ← ω_m^{bit-reversed(r)}
        r ← r + 1
        for j = 0 to J − 1 do
            u ← A_{2kJ+j}
            v ← A_{2kJ+j+J}
            A_{2kJ+j} ← (u + v · ω) mod q
            A_{2kJ+j+J} ← (u − v · ω) mod q
        end for
    end for
end for
return A
```

and AVX2.

Radix-2^k NTT algorithm. The appearance of radix-2^2 is a milestone in FFT hardware design, which is extended to radix-2^k later [GGMG13]. The radix-4 FFT is preferable to be applied in high-throughput-demanding applications [SYJ84]. In analogy with FFT, we can also obtain the radix-2^k NTT algorithm. Actually, in [ABCG20] [BKS19] [GOPS13] [CHK+21], the radix-2^k NTT algorithm is realized by merging multiple layers of radix-2 NTT on the resource-constrained micro-controller platforms. This method is leveraged to reduce the cache loading and storing overheads. In this paper, we will provide the detailed derivation of bit-reversed-free radix-4 NTT/INTT algorithm with low computation complexity. Furthermore, we point out that its hardware advantage in terms of better area-timing trade-off is benefited from the symmetric operators and less number of banks.

Properties of twiddle factor. In the deduction process, we will show that the low computation complexity and minimal memory footprint of NTT algorithm are based on the unique properties of twiddle factors, which can be generalized as four items :

$$\begin{aligned}
\text{Sum property:} \quad & \sum_{j=0}^{N-1} \omega_N^{kj} = \frac{(\omega_N^k)^N - 1}{\omega_N^k - 1} = \frac{(\omega_N^N)^k - 1}{\omega_N^k - 1} = 0 \quad \text{where} \quad k \nmid N \\
\text{Binary property:} \quad & \omega_N^{k+N/2} = -\omega_N^k \\
\text{Periodicity property:} \quad & \omega_N^{k+N} = \omega_N^k \\
\text{Elimination property:} \quad & \omega_{dN}^{dk} = \omega_N^k
\end{aligned} \tag{4}$$

It is easy to see that the Binary property can be derived from Elimination property and the $2N$-th roots of unity ϕ_{2N} also has similar properties.

2.2 Scalability of NTT Architecture

2.2.1 Dimensions of Scalability

Our scalable in-place NTT multiplication architecture considers four dimensions of scalability: length of data vector, different modulus, number of parallel butterfly units and arbitrary radix, which are denoted as N, q, d, R, respectively. While the configuration for N and q can be easily obtained, supporting different radix and multiple parallel butterfly units becomes a tough problem owing to the complex memory access in every stage. In fact, the interconnect network is an important component of NTT hardware, which guarantees the data points to be fetched and stored without conflicts so that no queues and reordering are needed. For example, [XHY+20] increases the number of parallel butterfly units to achieve high throughput in radix-2 NTT. For correct memory access, it proposes a permutation network, which needs six configuration modes and consumes more hardware resources. To reduce these overheads, we propose a more efficient conflict-free memory mapping scheme. This scheme is also valid for parallel non-radix-2 NTT hardware design.

Interleaved memory system. If the radix-R in-place NTT contains d butterfly units, R × d memory access should be performed in parallel. The memory bandwidth can be increased by partitioning the memory into R × d independent banks, which is referred to an interleaved (matched) memory system [TJS03]. To distribute data points over the interleaved memory system without conflict is a more difficult and universe problem compared to that of unmatched memory system. Because multiple data points can be stored into a single address by increasing the row-bandwidth in unmatched memory system. Its storage structure can be straightforwardly obtained according to the mapping scheme of interleaved memory system. Thus we focus on the memory mapping scheme for in-place NTT with interleaved memory system in this article.

2.2.2 Temporal and Spatial Conflicts

Temporal conflict. In pipelined NTT architecture, temporal conflict occurs when the read operation of stage k is performed before the write operation of stage $k-1$ [CMV+15]. Figure 1 provides an example of 16-points in-place radix-2 NTT for this read-before-write (RBW) conflict. In pipelined radix-2 in-place NTT architecture, the time between the last

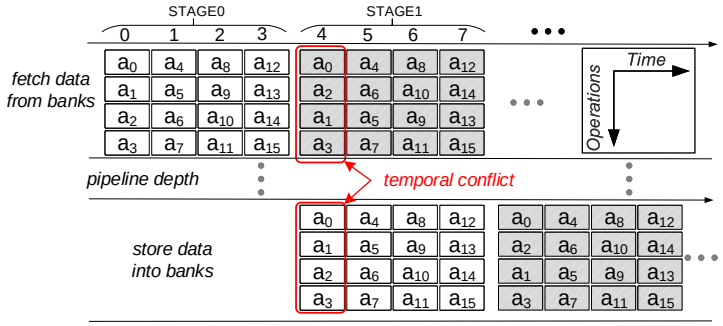
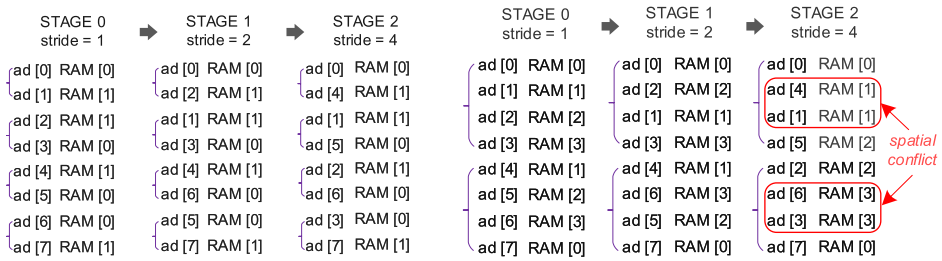


Figure 1: The temporal conflict in pipelined in-place NTT architecture.

two stages is the point at which conflict is most likely to occur. To avoid this conflict and achieve 100% usage of NTT processor, the pipeline depth ought to meet the condition: $\frac{N}{4d} \geq pipeline\ depth$. This condition will become more stringent when considering the higher radix NTT. Fortunately, the data vector size in PQC and FHE algorithm is from hundreds to millions magnitude, so this condition can be met under normal situations.

Spatial conflict. In every stage of NTT computation, if multiple data points are mapped onto the same bank, we need to perform several read or write operations on a single bank address simultaneously, which results in the so-called spatial conflict. [Joh92] proposes a memory mapping scheme for arbitrary in-place FFT hardware, which is described in Figure 2(a) taking 8 points radix-2 FFT as an example. However, [ZYC+20] and [XMX17] point



(a) Radix-2 in-place NTT with d = 1.

(b) Radix-2 in-place NTT with d = 2.

Figure 2: The spatial conflict in 8 points radix-2 in-place NTT.

out that this scheme is not suitable for the case when placing multiple butterfly units in every stage. This spatial conflict is shown in Figure 2(b) using 8 points radix-2 FFT with two butterfly units as an example. Instead of designing complex permutation networks as [XHY+20], we will propose a general and simple scheme to solve this problem in section 4.

3 Radix-4 DIT NTT and DIF INTT

3.1 DIT Radix-4 NTT with Low Complexity

The pre-processing requires N modular multiplications for each input vector as equation 3 shows. Based on the tricks of [ZYC+20] [POG15], we can still avoid this process by merging the $2N$-th roots of unity into every stage of Cooley-Tukey radix-4 DIT NTT algorithm. Thus, the number of modular multiplications is reduced from $(N \log_4 N) + 2N$ to $N \log_4 N$ in the proposed algorithm. Our derivation also follows the divide-and-conquer strategy in [Sto06], where the DFT is divided in time domain. Firstly, the pre-processing and the main NTT are written together as belows :

$$A_i = \sum_{j=0}^{N-1} a_j \phi_{2N}^{j} \omega_N^{ij} \bmod q \quad i = 0, 1, ..., N-1 \tag{5}$$

Then, by splitting the summation into four coresidual groups according to the time domain index j, the equation 6 is transformed as :

$$\begin{aligned} A_i = & \sum_{j=0}^{N/4-1} a_{4j} \phi_{2N}^{4j} \omega_N^{i\cdot(4j)} + \sum_{j=0}^{N/4-1} a_{4j+1} \phi_{2N}^{4j+1} \omega_N^{i\cdot(4j+1)} + \\ & \sum_{j=0}^{N/4-1} a_{4j+2} \phi_{2N}^{4j+2} \omega_N^{i\cdot(4j+2)} + \sum_{j=0}^{N/4-1} a_{4j+3} \phi_{2N}^{4j+3} \omega_N^{i\cdot(4j+3)} \bmod q \\ & i = 0, 1, ..., N-1 \end{aligned} \tag{6}$$

By leveraging the Elimination property of twiddle factor ω and ϕ, the equation 6 can be simplified as :

$$\begin{aligned} A_i = & \sum_{j=0}^{N/4-1} a_{4j} \phi_{N/2}^{j} \omega_{N/4}^{ij} + \omega_N^{i} \cdot \phi_{2N}^{1} \cdot \sum_{j=0}^{N/4-1} a_{4j+1} \phi_{N/2}^{j} \omega_{N/4}^{ij} + \\ & \omega_N^{2i} \cdot \phi_{2N}^{2} \cdot \sum_{j=0}^{N/4-1} a_{4j+2} \phi_{N/2}^{j} \omega_{N/4}^{ij} + \omega_N^{3i} \cdot \phi_{2N}^{3} \cdot \sum_{j=0}^{N/4-1} a_{4j+3} \phi_{N/2}^{j} \omega_{N/4}^{ij} \bmod q \\ & i = 0, 1, ..., N/4-1 \end{aligned} \tag{7}$$

For simplicity, let F_0, F_1, F_2 and F_3 denote the four summation items $\sum_{j=0}^{N/4-1} a_{4j} \phi_{N/2}^{j} \omega_{N/4}^{ij}$, $\sum_{j=0}^{N/4-1} a_{4j+1} \phi_{N/2}^{j} \omega_{N/4}^{ij}$, $\sum_{j=0}^{N/4-1} a_{4j+2} \phi_{N/2}^{j} \omega_{N/4}^{ij}$, $\sum_{j=0}^{N/4-1} a_{4j+3} \phi_{N/2}^{j} \omega_{N/4}^{ij}$, respectively. Then, the equation 7 is written as :

$$A_i = F_0 + \omega_N^{i} \cdot \phi_{2N}^{1} \cdot F_1 + \omega_N^{2i} \cdot \phi_{2N}^{2} \cdot F_2 + \omega_N^{3i} \cdot \phi_{2N}^{3} \cdot F_3 \quad i = 0, 1, ..., N/4-1 \tag{8}$$

Obviously, by applying the Periodicity property of twiddle factor, the other three equations can be obtained as:

$$\begin{aligned} A_{i+N/4} &= F_0 + \omega_N^{i} \cdot \omega_4^{1} \cdot \phi_{2N}^{1} \cdot F_1 + \omega_N^{2i} \cdot \omega_4^{2} \cdot \phi_{2N}^{2} \cdot F_2 + \omega_N^{3i} \cdot \omega_4^{3} \cdot \phi_{2N}^{3} \cdot F_3 \\ A_{i+2N/4} &= F_0 + \omega_N^{i} \cdot \omega_4^{2} \cdot \phi_{2N}^{1} \cdot F_1 + \omega_N^{2i} \cdot (\omega_4^{2})^2 \cdot \phi_{2N}^{2} \cdot F_2 + \omega_N^{3i} \cdot (\omega_4^{3})^2 \cdot \phi_{2N}^{3} \cdot F_3 \\ A_{i+3N/4} &= F_0 + \omega_N^{i} \cdot \omega_4^{3} \cdot \phi_{2N}^{1} \cdot F_1 + \omega_N^{2i} \cdot (\omega_4^{2})^3 \cdot \phi_{2N}^{2} \cdot F_2 + \omega_N^{3i} \cdot (\omega_4^{3})^3 \cdot \phi_{2N}^{3} \cdot F_3 \\ & i = 0, 1, ..., N/4-1 \end{aligned} \tag{9}$$

According to the Sum property and Binary property, we can derive that $\omega_4^3 = -\omega_4^1$, $\omega_4^2 = -\omega_4^0 = -1$. So we can express the equation 8 and 9 in the form of matrix as belows:

$$\begin{bmatrix} A_i \\ A_{i+N/4} \\ A_{i+2N/4} \\ A_{i+3N/4} \end{bmatrix} = \left(\begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & \omega_4^1 & -1 & -\omega_4^1 \\ 1 & -1 & 1 & -1 \\ 1 & -\omega_4^1 & -1 & \omega_4^1 \end{bmatrix} \times \begin{bmatrix} F_0 \\ F_1 \\ F_2 \\ F_3 \end{bmatrix} \right) \cdot \begin{bmatrix} 1 \\ \omega_N^i \cdot \phi_{2N}^1 \\ \omega_N^{2i} \cdot \phi_{2N}^2 \\ \omega_N^{3i} \cdot \phi_{2N}^3 \end{bmatrix} \quad i = 0, 1, ..., N/4-1 \tag{10}$$

Note that F_0, F_1, F_2 and F_3 are actually the four $N/4$-points NTTs, essentially similar to equation 6. By adopting this divide-and-conquer strategy recursively until $\frac{N}{4}$ 4-points, we can obtain the radix-4 NTT algorithm. Furthermore, by merging the powers of N-th roots of unity ω_N and $2N$-th roots of unity ϕ_{2N} in equation 10, we can obtain that:

$$\begin{bmatrix} A_i \\ A_{i+N/4} \\ A_{i+2N/4} \\ A_{i+3N/4} \end{bmatrix} = \left(\begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & \omega_4^1 & -1 & -\omega_4^1 \\ 1 & -1 & 1 & -1 \\ 1 & -\omega_4^1 & -1 & \omega_4^1 \end{bmatrix} \times \begin{bmatrix} F_0 \\ F_1 \\ F_2 \\ F_3 \end{bmatrix} \right) \cdot \begin{bmatrix} 1 \\ \phi_{2N}^{2i+1} \\ \phi_{2N}^{2(2i+1)} \\ \phi_{2N}^{3(2i+1)} \end{bmatrix} \quad i = 0, 1, ..., N/4-1 \tag{11}$$

Up to now, we just need to precompute the powers of ϕ_{2N} for storage, eliminating the pre-processing of $2N$ modular multiplication completely.

3.2 DIF Radix-4 INTT with Low Complexity

By merging the scale factor N^{-1} and powers of $2N$-th roots of unity ϕ_{2N}^{-1} into every stage, the number of modular multiplications in radix-4 INTT algorithm can be reduced from $N \log_4 N + N$ to $N \log_4 N$ [ZYC+20] [POG15]. At this time, we will adopt the strategy in [GS66], where the DFT is divided in frequency domain and it turns out the so-called Gentleman-Sande Butterfly. At the very beginning, the post-processing and the main INTT are written together as:

$$a_i = N^{-1} \cdot \phi_{2N}^{-i} \cdot \sum_{j=0}^{N-1} A_j \omega_N^{-ij} \bmod q \quad i = 0, 1, ..., N-1 \tag{12}$$

According to the index i, we can split the summation into four consecutive groups with the same size $N/4$. Then, the equation 12 is transformed as:

$$\begin{aligned} a_i = N^{-1} \cdot (\phi_{2N}^{-i} \cdot \sum_{j=0}^{N/4-1} A_j \phi_{2N}^{-j} \omega_N^{-ij} + \phi_{2N}^{-i} \cdot \sum_{j=N/4}^{2N/4-1} A_j \omega_N^{-ij} + \\ \phi_{2N}^{-i} \cdot \sum_{j=2N/4}^{3N/4-1} A_j \omega_N^{-ij} + \phi_{2N}^{-i} \cdot \sum_{j=3N/4}^{N-1} A_j \omega_N^{-ij}) \bmod q \quad i = 0, 1, ..., N-1 \end{aligned} \tag{13}$$

Based on the Periodicity and Binary property of twiddle factor, we can put the four summation items into the same range $[0, N/4-1]$:

$$\begin{aligned} a_i = N^{-1} \cdot (\phi_{2N}^{-i} \cdot \sum_{j=0}^{N/4-1} A_j \omega_N^{-ij} + \phi_{2N}^{-i} \cdot \sum_{j=0}^{N/4-1} A_{j+N/4} \omega_N^{-i\cdot(j+N/4)} + \\ \phi_{2N}^{-i} \cdot \sum_{j=0}^{N/4-1} A_{j+2N/4} \omega_N^{-i\cdot(j+2N/4)} + \phi_{2N}^{-i} \cdot \sum_{j=0}^{N/4-1} A_{j+3N/4} \omega_N^{-i\cdot(j+3N/4)}) \bmod q \\ i = 0, 1, ..., N/4-1 \end{aligned} \tag{14}$$

Because of the Elimination property, the equation 14 can be simplified as:

$$\begin{aligned} a_i = N^{-1} \cdot (\phi_{2N}^{-i} \cdot \sum_{j=0}^{N/4-1} A_j \omega_N^{-ij} + \phi_{2N}^{-i} \cdot \omega_4^{-i} \cdot \sum_{j=0}^{N/4-1} A_{j+N/4} \omega_N^{-ij} + \\ \phi_{2N}^{-i} \cdot \omega_4^{-2i} \cdot \sum_{j=0}^{N/4-1} A_{j+2N/4} \omega_N^{-ij} + \phi_{2N}^{-i} \cdot \omega_4^{-3i} \cdot \sum_{j=0}^{N/4-1} A_{j+3N/4} \omega_N^{-ij}) \bmod q \\ i = 0, 1, ..., N/4-1 \end{aligned} \tag{15}$$

Note that the factors ω_4^{-i}, ω_4^{-2i}, ω_4^{-3i} can be classified into four cases according to the coresidual groups of index i:

$$\omega_4^{-i} = \begin{cases} 0 & i = 4r \\ \omega_4^{-1} & i = 4r+1 \\ -1 & i = 4r+2 \\ -\omega_4^{-1} & i = 4r+3 \end{cases} \quad \omega_4^{-2i} = \begin{cases} 1 & i = 4r \\ -1 & i = 4r+1 \\ 1 & i = 4r+2 \\ -1 & i = 4r+3 \end{cases} \quad \omega_4^{-3i} = \begin{cases} 0 & i = 4r \\ \omega_4^{-1} & i = 4r+1 \\ -1 & i = 4r+2 \\ -\omega_4^{-1} & i = 4r+3 \end{cases}$$
$$r = 0, 1, ..., N/4-1 \tag{16}$$

As a result, the equation 16 can be grouped into four parts based on the coresidual groups of index i, correspondingly. With the Elimination property of twiddle factor, the first part can be further written as:

$$\begin{aligned} a_{4i} = (\frac{N}{4})^{-1} \cdot (\frac{1}{4} \cdot \phi_{N/2}^{-i} \cdot \sum_{j=0}^{N/4-1} A_j \omega_{N/4}^{-ij} + \frac{1}{4} \cdot \phi_{N/2}^{-i} \cdot \sum_{j=0}^{N/4-1} A_{j+N/4} \omega_{N/4}^{-ij} + \\ \frac{1}{4} \cdot \phi_{N/2}^{-i} \cdot \sum_{j=0}^{N/4-1} A_{j+2N/4} \omega_{N/4}^{-ij} + \frac{1}{4} \cdot \phi_{N/2}^{-i} \cdot \sum_{j=0}^{N/4-1} A_{j+3N/4} \omega_{N/4}^{-ij}) \bmod q \\ i = 0, 1, ..., N/4-1 \end{aligned} \tag{17}$$

For simplicity, let G_0,G_1,G_2,G_3 denote the four summation items, respectively.

$$G_m = (\frac{N}{4})^{-1} \cdot \phi_{N/2}^{-i} \cdot \sum_{j=0}^{N/4-1} \frac{1}{4} A_{j+mN/4} \phi_{N/2}^{-i} \omega_{N/4}^{-ij} \quad m = 0, 1, 2, 3 \tag{18}$$

Thus, the four parts of equation 16 can be expressed as:

$$\begin{aligned} a_{4i} &= G_0 + G_1 + G_2 + G_3 \\ a_{4i+1} &= \phi_{2N}^{-1} \cdot \omega_N^{-j} \cdot (G_0 + \omega_4^{-1} G_1 + \omega_4^{-2} G_2 + \omega_4^{-3} G_3) \\ a_{4i+2} &= \phi_{2N}^{-2} \cdot \omega_N^{-2j} \cdot [G_0 + \omega_4^{-2} G_1 + (\omega_4^{-2})^2 G_2 + (\omega_4^{-3})^2 G_3] \\ a_{4i+3} &= \phi_{2N}^{-3} \cdot \omega_N^{-3j} \cdot [G_0 + \omega_4^{-3} G_1 + (\omega_4^{-2})^3 G_2 + (\omega_4^{-3})^3 G_3] \\ i &= 0, 1, ..., N/4-1 \end{aligned} \tag{19}$$

With the Sum and Binary property, we can derive that $\omega_4^{-3} = -\omega_4^{-1}$, $\omega_4^{-2} = -\omega_4^0 = -1$. Thus, the equation 20 is further expressed in matrix form:

$$\begin{aligned} \begin{bmatrix} a_{4i} \\ a_{4i+1} \\ a_{4i+2} \\ a_{4i+3} \end{bmatrix} = \left(\begin{bmatrix} G_0 \\ G_1 \\ G_2 \\ G_3 \end{bmatrix} \cdot \begin{bmatrix} 1 \\ \omega_N^{-j} \cdot \phi_{2N}^{-1} \\ \omega_N^{-2j} \cdot \phi_{2N}^{-2} \\ \omega_N^{-3j} \cdot \phi_{2N}^{-3} \end{bmatrix} \right) \times \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & \omega_4^{-1} & -1 & -\omega_4^{-1} \\ 1 & -1 & 1 & -1 \\ 1 & -\omega_4^{-1} & -1 & \omega_4^{-1} \end{bmatrix} \\ i = 0, 1, ..., N/4-1 \end{aligned} \tag{20}$$

In this way, the N-points INTT can be divided into four $\frac{N}{4}$-points INTTs. By adopting this strategy recursively until $\frac{N}{4}$ 4-points INTTs, we can obtain the DIF radix-4 INTT algorithm. Note that the scale factor is also merged into each stage and the equation 20 can be further written as:

$$\begin{bmatrix} a_{4i} \\ a_{4i+1} \\ a_{4i+2} \\ a_{4i+3} \end{bmatrix} = \left(\begin{bmatrix} G_0 \\ G_1 \\ G_2 \\ G_3 \end{bmatrix} \cdot \begin{bmatrix} 1 \\ \phi_{2N}^{-(2j+1)} \\ \phi_{2N}^{-2(2j+1)} \\ \phi_{2N}^{-3(2j+1)} \end{bmatrix} \right) \times \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & \omega_4^{-1} & -1 & -\omega_4^{-1} \\ 1 & -1 & 1 & -1 \\ 1 & -\omega_4^{-1} & -1 & \omega_4^{-1} \end{bmatrix} \tag{21}$$
$$i = 0, 1, ..., N/4 - 1$$

By now, we just need to precalculate the powers of $2N$-th roots of unity ϕ_{2N}^{-1} for storage and the post-processing of N-modular multiplication is removed completely.

3.3 Improvement with Divide and Schedule Method

In this section, a versatile schedule method is utilized to reduce the number of modular multiplications and modular additions/subtractions by 20% and 30%, respectively. Thereafter, the complete radix-4 DIT NTT algorithm and radix-4 DIF INTT algorithm with low complexity are presented.

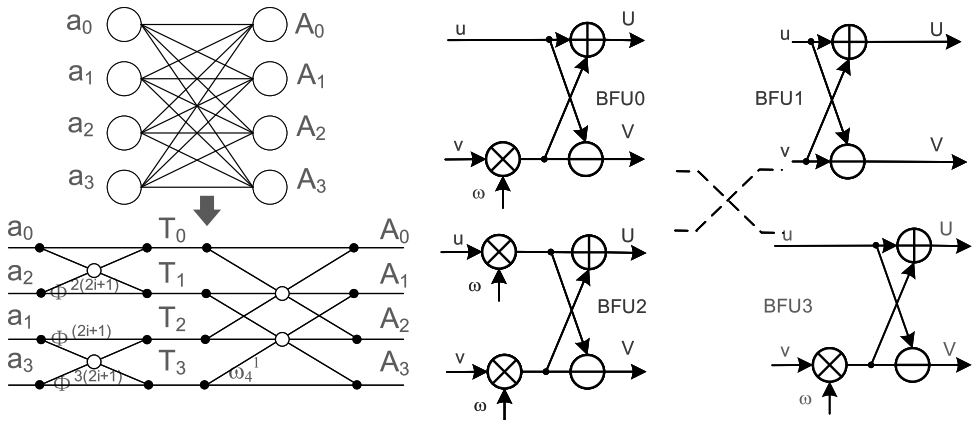


Figure 3: The radix-4 Cookley-Tukey butterfly unit.

Divide and schedule in radix-4 Cooley-Tukey butterfly. When directly calculating the equation 11, it will take 5 modular multiplications, 6 modular additions and 6 modular subtractions. However, based on the divide-and-conquer idea, this computation complexity can be further reduced [HT96]. It is easy to see that some immediate results can be reused when calculating the raidx-4 butterfly operation. Thus, we schedule the matrix multiplication into two-layer operations as belows:

$$\begin{aligned} T_0 &= (F_0 + F_2 \cdot \phi_{2N}^{2(2i+1)}) & A_i &= T_0 + T_2 \\ T_1 &= (F_0 - F_2 \cdot \phi_{2N}^{2(2i+1)}) & A_{i+N/4} &= (T_1 + T_3 \cdot \omega_4^1) \\ T_2 &= (F_1 \cdot \phi_{2N}^{2i+1} + F_3 \cdot \phi_{2N}^{3(2i+1)}) & A_{i+2N/4} &= (T_0 - T_2) \\ T_3 &= (F_1 \cdot \phi_{2N}^{2i+1} - F_3 \cdot \phi_{2N}^{3(2i+1)}) & A_{i+3N/4} &= (T_1 - T_3 \cdot \omega_4^1) \end{aligned} \tag{22}$$

At this time, the radix-4 butterfly unit operation is reduced to 4 modular multiplications and 4 modular additions and 4 modular subtractions, which results in the two-layer

Algorithm 2 Radix-4 DIT Iterative NTT Algorithm

Input: $\boldsymbol{a}$ denotes a vector of length N, q is modulus and ϕ_{2N} is $2N$-th primitive roots of unity. ω_4^1 is 4-th primitive roots of unity.
Output: $\boldsymbol{A} = DIT\_NTT(\boldsymbol{a})$

$\boldsymbol{A} \leftarrow$ bit reverse($\boldsymbol{a}$)
for $p = 0$ to $\log_4 N - 1$ **do**
  $J \leftarrow 4^p$
  $\omega_m \leftarrow \phi_{2N}^{N/(4J)}$
  for $k = 0$ to $N/(4J) - 1$ **do**
    for $j = 0$ to $J - 1$ **do**
      $T_0 \leftarrow (a_{4kJ+j} + a_{4kJ+j+2J} \cdot \omega_m^{2(2j+1)}) \bmod q$
      $T_1 \leftarrow (a_{4kJ+j} - a_{4kJ+j+2J} \cdot \omega_m^{2(2j+1)}) \bmod q$
      $T_2 \leftarrow (a_{4kJ+j+J} \cdot \omega_m^{2j+1} + a_{4kJ+j+3J} \cdot \omega_m^{3(2j+1)}) \bmod q$
      $T_3 \leftarrow (a_{4kJ+j+J} \cdot \omega_m^{2j+1} - a_{4kJ+j+3J} \cdot \omega_m^{3(2j+1)}) \bmod q$
      $A_{4kJ+j} \leftarrow (T_0 + T_2) \bmod q$
      $A_{4kJ+j+J} \leftarrow (T_1 + T_3 \cdot \omega_4^1) \bmod q$
      $A_{4kJ+j+2J} \leftarrow (T_0 - T_2) \bmod q$
      $A_{4kJ+j+3J} \leftarrow (T_1 - T_3 \cdot \omega_4^1) \bmod q$
    end for
  end for
end for
return $\boldsymbol{A}$

Cooley-Tukey butterfly unit. The Figure 3 can depict this change intuitively and presents the detailed architecture. As a result, the complete two-layer radix-4 DIT NTT with low complexity is demonstrated in algorithm 2.

Divide and schedule in radix-4 Gentleman-Sande butterfly. Similar to radix-4 NTT, the complexity in radix-4 INTT butterfly operation can also be further reduced. Using straightforward method to compute the equation 20 still requires 5 modular multiplications, 6 modular additions and 6 modular subtractions. Thus, by scheduling the matrix multiplication to reuse the immediate result, we obtain that:

$$\begin{aligned} T_0 &= F_0 + F_2 & a_{4i} &= T_0 + T_2 \\ T_1 &= F_0 - F_2 & a_{4i+1} &= (T_1 + T_3) \cdot \phi_{2N}^{-(2j+1)} \\ T_2 &= F_1 + F_3 & a_{4i+2} &= (T_0 - T_2) \cdot \phi_{2N}^{-2(2j+1)} \\ T_3 &= (F_1 - F_3) \cdot \omega_4^{-1} & a_{4i+3} &= (T_1 - T_3) \cdot \phi_{2N}^{-3(2j+1)} \end{aligned} \tag{23}$$

In this way, we just need 4 modular multiplications, 4 modular multiplications and 4 modular additions and 4 modular subtractions, which results in the two-layer Gentleman-Sande butterfly unit. The Figure 4 also presents the changes and detailed architecture. Since the ω_4^1 and ω_4^{-1} are constants, the multiplication in BFU3 and IBFU2 can be alternatively implemented with a series of additions and shifts. So far, the complete two-layer radix-4 DIF INTT with low complexity is demonstrated in algorithm 3.

3.4 Avoiding Bit-reversed Cost and Reducing Memory Footprint

When straightly performing the classic in-place DIT NTT and DIF INTT as [ZYC+20] [XHY+20] [MKÖ+20b], bit-reversed operation is required at the very beginning of NTT and ending of INTT, respectively. Because the classic DIT NTT receives the input vector with bit-reversed order and produces the output vector with natural order. The classic DIF INTT is contrary to the orientation of DIT NTT. [POG15] [XL21] [CG99] avoid the bit-reversed operation for radix-2 DIT NTT and DIF INTT by rearranging the loop structure and storage structure of twiddle factors. In this section, we will generalize this bit-reversed issue for arbitrary radix DIT NTT and DIF INTT and propose the

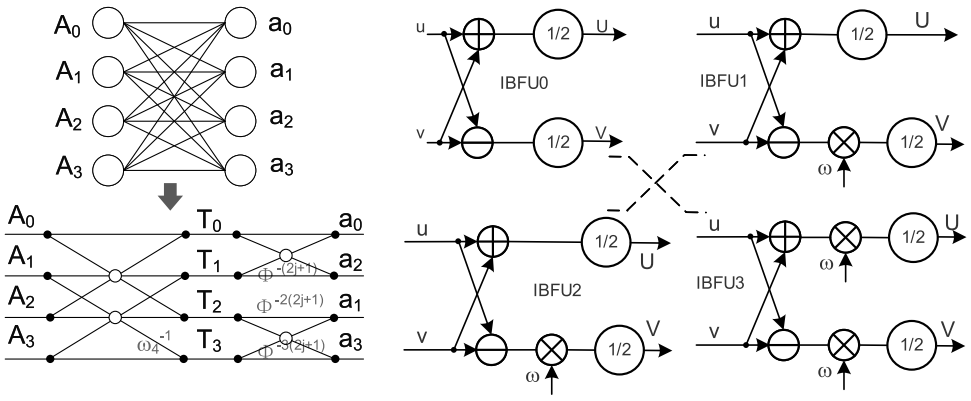


Figure 4: The radix-4 Gentleman-Sande butterfly unit.

Algorithm 3 Radix-4 DIF Iterative INTT Algorithm

Input: $\boldsymbol{a}$ denotes a vector of length N, q is modulus and ϕ_{2N}^{-1} is inverse element of $2N$-th primitive roots of unity. ω_4^{-1} is inverse element of 4-th primitive roots of unity.
Output: $\boldsymbol{A} = DIF\_INTT(\boldsymbol{a})$

for $p = \log_4 N - 1$ to 0 **do**
  $J \leftarrow 4^p$
  $\omega_m \leftarrow \phi_{2N}^{-N/(4J)}$
  for $k = 0$ to $N/(4J) - 1$ **do**
    for $j = 0$ to $J - 1$ **do**
      $T_0 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j} + a_{4kJ+j+2J}) \bmod q$
      $T_1 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j} - a_{4kJ+j+2J}) \bmod q$
      $T_2 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j+J} + a_{4kJ+j+3J}) \bmod q$
      $T_3 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j+J} - a_{4kJ+j+3J}) \cdot \omega_4^{-1} \bmod q$
      $A_{4kJ+j} \leftarrow \frac{1}{2} \cdot (T_0 + T_2) \bmod q$
      $A_{4kJ+j+J} \leftarrow \frac{1}{2} \cdot (T_1 + T_3) \cdot \omega_m^{-(2j+1)} \bmod q$
      $A_{4kJ+j+2J} \leftarrow \frac{1}{2} \cdot (T_0 - T_2) \cdot \omega_m^{-2(2j+1)} \bmod q$
      $A_{4kJ+j+3J} \leftarrow \frac{1}{2} \cdot (T_1 - T_3) \cdot \omega_m^{-3(2j+1)} \bmod q$
    end for
  end for
end for
$\boldsymbol{A} \leftarrow$ bit reverse($\boldsymbol{A}$)
return $\boldsymbol{A}$

bit-reversed-free radix-4 DIT NTT and DIF INTT algorithm, respectively. We use the notation NR (RN) as belows to represent that the input vector is received in natural (bit-reversed) order and the output vector is produced in bit-reversed (natural) order. In addition, we will show how the memory footprint can be reduced by reusing the twiddle factors of forward radix-2/4 NTT in the inverse radix-2/4 NTT.

3.4.1 Proposed DIT-NR Radix-4 NTT

In DIT NTT, the bit-reversed-free trait indicates that the input vector is received in natural order and the output vector is produced in bit-reversed order, which is opposite to the classic DIT NTT. [CG99] obtains the radix-2 bit-reversed-free DIT NTT by changing the loop structure and the storage method of twiddle factors. Inspired by this work, we derive the radix-4 bit-reversed-free DIT NTT algorithm. Based on this derivation, the bit-reversed operation in arbitrary radix NTT can be removed. This optimization technique is achieved by three important observations as belows:

(1) In analogy with classic DIF INTT algorithm, the address with natural order in DIT NTT can be generated by just reversing the first loop.

(2) To still obtain the correct results after reversing the first loop, the generation of twiddle factors are required to rearranged accordingly.

(3) After performing the operation in (1), the iterative principle of index j and k in algorithm 2 will exactly exchange with each other.

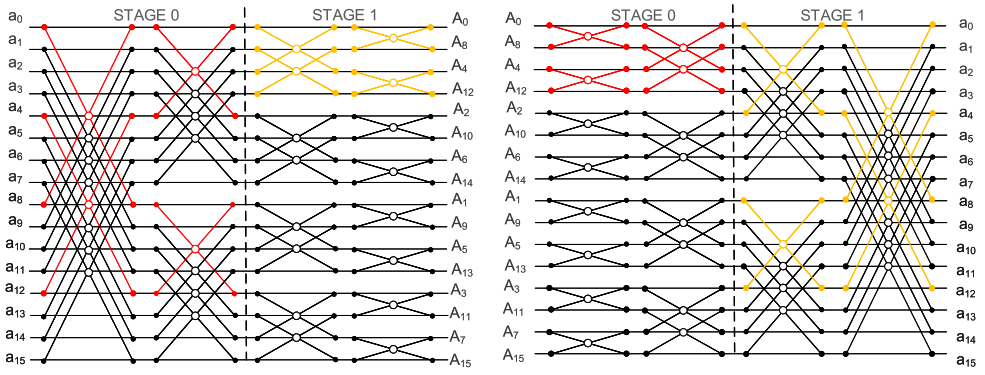
As a result, the arrangement of twiddle factors in item (2) can be realized with three steps based on item (3). The first step is to move the place of generating twiddle factors from the innermost loop j to the middle loop k. The second step is to replace the index j in exponential position of twiddle factors in algorithm 2 with bit-reversed index k. The final step is to replace the powers $N/(4J)$ in algorithm 2 line 4 with powers J. It is worth to mention that this method can also be applied in DIT NTT of other radix to avoid the bit-reversed cost. The detailed changes in terms of the generation of twiddle factors can be described in equation 24.

$$\begin{aligned} \phi_{2N}^{N/(4J)} &\Rightarrow \phi_{2N}^{J} & \omega_m^{2j+1} &\Rightarrow \omega_m^{2\text{bit-reversed}(k)+1} \\ \omega_m^{2(2j+1)} &\Rightarrow \omega_m^{2\cdot(2\text{bit-reversed}(k)+1)} & \omega_m^{3(2j+1)} &\Rightarrow \omega_m^{3\cdot(2\text{bit-reversed}(k)+1)} \end{aligned} \tag{24}$$

In the hardware implementation, the twiddle factors are actually precomputed and stored in the ROM. Hence, we propose the complete bit-reversed-free radix-4 DIT NTT in algorithm 4 along with the method of precomputing twiddle factors. Figure 5(a) presents the corresponding 16-points dataflow of radix-4 DIT-NR NTT where the input vector is accepted in natural order and the output vector is produced in bit-reversed order. The lines with red and yellow color represent the first-round butterfly operation in stage 0 and stage 1, respectively.

3.4.2 Proposed DIF-RN Radix-4 INTT

In DIF INTT, the bit-reversed-free trait indicates that the input vector is received in bit-reversed order and the output vector is produced in natural order, which is also opposite to the classic DIF INTT. Based on DIT-NR NTT, we can obtain the DIF-RN INTT with a direct method by just reversing the fisrt loop in algorithm 3 line 1 and replacing the twiddle factor in equation 24 with its inverse element. Nevertheless, this method cannot lead to a perfect implementation in terms of memory footprint. As shown in the reference



(a) The data flow of radix-4 DIT-NR NTT. (b) The data flow of radix-4 DIF-RN INTT.

Figure 5: The data flow of 16 points radix-4 NTT/INTT.

Algorithm 4 Radix-4 DIT-NR NTT Algorithm

Input: $\boldsymbol{a}$ denotes a vector of length N, q is modulus and ϕ_{2N} is $2N$-th primitive roots of unity. ω_4^1 is 4-th primitive roots of unity.
Output: $\boldsymbol{A}$ = DIT-NR NTT($\boldsymbol{a}$)

Precompute the twiddle factors:
for $p = \log_4 N - 1$ to 0 **do**
  $J \leftarrow 4^p$
  $\omega_m \leftarrow \phi_{2N}^J$
  for $k = 0$ to $N/(4J) - 1$ **do**
    $\omega a1\_\text{ROM.append } [\omega_m^{2\text{bit-reversed}(k)+1}]$
    $\omega a2\_\text{ROM.append } [\omega_m^{2\cdot(2\text{bit-reversed}(k)+1)}]$
    $\omega a3\_\text{ROM.append } [\omega_m^{3\cdot(2\text{bit-reversed}(k)+1)}]$
  end for
end for
Perform the radix-4 DIT-NR NTT:
for $p = \log_4 N - 1$ to 0 **do**
  $J \leftarrow 4^p$
  $r \leftarrow 0$
  for $k = 0$ to $N/(4J) - 1$ **do**
    $\omega_1 \leftarrow \omega a1\_\text{ROM } [r]$
    $\omega_2 \leftarrow \omega a2\_\text{ROM } [r]$
    $\omega_3 \leftarrow \omega a3\_\text{ROM } [r]$
    $r \leftarrow r + 1$
    for $j = 0$ to $J - 1$ **do**
      $T_0 \leftarrow (a_{4kJ+j} + a_{4kJ+j+2J} \cdot \omega_2) \bmod q$
      $T_1 \leftarrow (a_{4kJ+j} - a_{4kJ+j+2J} \cdot \omega_2) \bmod q$
      $T_2 \leftarrow (a_{4kJ+j+J} \cdot \omega_1 + a_{4kJ+j+3J} \cdot \omega_3) \bmod q$
      $T_3 \leftarrow (a_{4kJ+j+J} \cdot \omega_1 - a_{4kJ+j+3J} \cdot \omega_3) \bmod q$
      $A_{4kJ+j} \leftarrow (T_0 + T_2) \bmod q$
      $A_{4kJ+j+J} \leftarrow (T_1 + T_3 \cdot \omega_4^1) \bmod q$
      $A_{4kJ+j+2J} \leftarrow (T_0 - T_2) \bmod q$
      $A_{4kJ+j+3J} \leftarrow (T_1 - T_3 \cdot \omega_4^1) \bmod q$
    end for
  end for
end for
return $\boldsymbol{A}$

software implementation of Kyber from NIST, the twiddle factors in radix-2 DIF INTT can reuse the twiddle factors of radix-2 DIT INTT by leveraging the Binary property: $\phi_{2N}^N = -1 \bmod q \Rightarrow \phi_{2N}^{-i} = -\phi_{2N}^N \cdot \phi_{2N}^{-i} \bmod q = -\phi_{2N}^{N-i} \bmod q$. In this section, we show that the twiddle factors in radix-4 DIT-NR NTT can also be reused in radix-4 DIF-RN INTT by making full use of the properties of twiddle factors and suitable schedule. Fistly, we derive three tricks shown in equation 25 from the Binary and Elimination property of twiddle factors:

$$\begin{aligned}
&\phi_{2N}^{-i} \bmod q = \phi_{2N}^{-N/2} \cdot \phi_{2N}^{N/2-i} \bmod q = \omega_4^{-1} \cdot \phi_{2N}^{N/4-i} \bmod q = -\omega_4^1 \cdot \phi_{2N}^{N/2-i} \bmod q \\
&\phi_{2N}^{-i} \bmod q = -\phi_{2N}^{N} \cdot \phi_{2N}^{N-i} \bmod q = -\phi_{2N}^{N-i} \bmod q \\
&\phi_{2N}^{-i} \bmod q = \phi_{2N}^{-3N/2} \cdot \phi_{2N}^{3N/2-i} \bmod q = -\phi_{2N}^{-N/2} \cdot \phi_{2N}^{3N/2-i} \bmod q \\
&\qquad\qquad = -\omega_4^{-1} \cdot \phi_{2N}^{3N/2-i} \bmod q = \omega_4^1 \cdot \phi_{2N}^{3N/2-i} \bmod q
\end{aligned} \tag{25}$$

Then, we apply these three tricks into equation 24 to obtain the inverse twiddle factor in algorithm 3 as belows:

$$\begin{aligned}
\omega_m^{-(2j+1)} &\Rightarrow -\omega_4^1 \cdot \omega_m^{N/2-[2\text{bit-reversed}(k)+1]} \\
\omega_m^{-2(2j+1)} &\Rightarrow -\omega_m^{N-[2\cdot(2\text{bit-reversed}(k)+1)]} \\
\omega_m^{-3(2j+1)} &\Rightarrow \omega_4^1 \cdot \omega_m^{3N/2-[3\cdot(2\text{bit-reversed}(k)+1)]}
\end{aligned} \tag{26}$$

Note that the factor ω_4^1 can be scheduled to multiply with ω_4^{-1} in algorithm 3 line 9. So applying the equation 26 into the two-layer butterfly operation of algorithm 3 will not increase the original complexity. To this end, we can reuse the twiddle factors generated in algorithm 4, which turns out the complete bit-reversed-free DIF INTT algirthm 5. As a result, the bit-reversed-free radix-4 Gentleman Sande butterfly unit can be obtained by just exchanging the position of IBFU0 with IBFU2 and swapping the two operands of modular subtracter in Figure 4. Figure 5(b) presents the corresponding 16-points dataflow of radix-4 DIF-RN INTT where the input vector are accepted in bit-reversed order and the output vector are produced in natural order. The lines with red and yellow color also represent the first-round butterfly operation in stage 0 and stage 1, respectively.

Algorithm 5 Radix-4 DIF-RN INTT Algorithm

Input: $\boldsymbol{a}$ denotes a vector of length N, q is modulus and $\omega a1$_ROM, $\omega a2$_ROM, $\omega a3$_ROM are three arrays generated by algorithm 4.
Output: $\boldsymbol{A}$ = DIF-RN INTT($\boldsymbol{a}$)

1: **for** $p = 0$ to $\log_4 N - 1$ **do**
2: $J \leftarrow 4^p$
3: $r \leftarrow \frac{N-1}{3} - 1$
4: **for** $k = 0$ to $N/(4J) - 1$ **do**
5: $\omega_1 \leftarrow \omega a1\_\text{ROM}\ [r]$
6: $\omega_2 \leftarrow \omega a2\_\text{ROM}\ [r]$
7: $\omega_3 \leftarrow \omega a3\_\text{ROM}\ [r]$
8: $r \leftarrow r - 1$
9: **for** $j = 0$ to $J - 1$ **do**
10: $T_0 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j} + a_{4kJ+j+2J}) \bmod q$
11: $T_1 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j+2J} - a_{4kJ+j}) \cdot \omega_4^1 \bmod q$
12: $T_2 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j+J} + a_{4kJ+j+3J}) \bmod q$
13: $T_3 \leftarrow \frac{1}{2} \cdot (a_{4kJ+j+3J} - a_{4kJ+j+J}) \bmod q$
14: $A_{4kJ+j} \leftarrow \frac{1}{2} \cdot (T_0 + T_2) \bmod q$
15: $A_{4kJ+j+J} \leftarrow \frac{1}{2} \cdot (T_1 + T_3) \cdot \omega_1 \bmod q$
16: $A_{4kJ+j+2J} \leftarrow \frac{1}{2} \cdot (T_2 - T_0) \cdot \omega_2 \bmod q$
17: $A_{4kJ+j+3J} \leftarrow \frac{1}{2} \cdot (T_3 - T_1) \cdot \omega_3 \bmod q$
18: **end for**
19: **end for**
20: **end for**
21: **return** $\boldsymbol{A}$

4 Conflict-free Memory Mapping Scheme

By applying loop unroll technique, a scalable iterative NTT algorithm is proposed in section 4.1. Thereafter, the general and efficient conflict-free memory mapping scheme is presented in section 4.2. Based on the scalable algorithm and memory mapping scheme, the NTT multiplication architecture can be parallelized.

4.1 Scalable Iterative NTT Algorithm

Determining the order. At the very beginning, we determine the way how the data points are managed in parallel computation. Taking DIT-NR radix-2 NTT with 2 butterfly units as an example, the 8 points data flow along with index set $\{p, k, j\}$ is depicted in Figure 6. Let $G^0_{p,k,j}$ and $G^1_{p,k,j}$ denote the upper and lower point in stage p, group k and round j, respectively. The butterfly operations with the some color belong to the same group. Then, we determine the parallel 4 data points in the second stage of 8-points INTT are fetched and stored in the following order: $\{G^0_{1,0,0}, G^1_{1,0,0}, G^0_{1,0,1}, G^1_{1,0,1}\} \rightarrow \{G^0_{1,1,0}, G^1_{1,1,0}, G^0_{1,1,1}, G^1_{1,1,1}\}$. It is easy to see that the parallel data points are managed gradually according to the growing order of index k. For 16 points radix-4 INTT with 8 parallel butterfly units, it

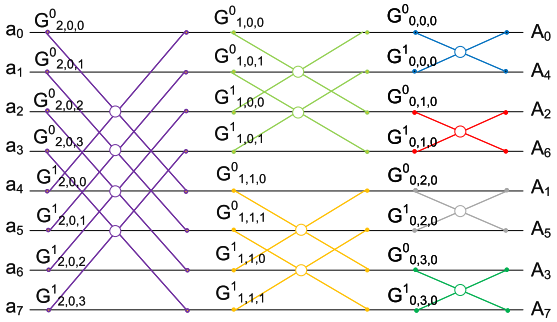


Figure 6: The data flow of 8 points radix-2 DIT-NR NTT.

also goes the same way with radix-2 to fetch and store the 8 data points.

Scalable NTT algorithm. We present the scalable iterative algorithm for arbitrary radix-R NTT based on the determined address order. However, applying the loop unroll method in iterative NTT algorithm directly can not lead to a perfect implementation. Because the range of index j, k in the inner loop and middle loop depends on the index p in the outer loop. The relative size of d and J will influence the number of iterations. As a result, the loop unroll method is classified into 2 cases: (1) $J < d$, the parallel data sets will contain several iterations of inner loop. (2) $J \geq d$, the inner loop will cover several parallel data sets. The scalable iterative NTT algorithm is proposed in algorithm 6. To be clear, the concrete butterfly operation is leaved out while the address generation method is kept.

4.2 Solution to Conflict Issue

To address the spatial conflict in section 2.2.2, we propose an efficient memory mapping scheme as belows:

N : total number of data points

r^k : radix of NTT, r is a prime, $r^k = R$

d : number of parallel butterfly units, it also stands for step size

B : number of banks, $B = R \times d$ and $N \mid B$ in the interleaved memory system

T : the total bit width of old address expressed in radix r, $T = log_r^N$

M : the bit width of bank number value expressed in radix r, $M = log_r^B = log_r^{R \times d}$

C : the bit width of step size expressed in radix r, $C = T - M$

The old address a can be expressed in radix r as:

$$a = [a_{T-1}, a_{T-2}, ..., a_1, a_0]_r = [a_{T-1}, ..., a_{T-C}, ..., a_{M-1} ..., a_1, a_0]_r$$

Expressing the lower part $[a_{M-1} ..., a_1, a_0]_r$ in radix B as $[b]_B$

Expressing the higher part $[a_{T-1} ..., a_{T-C}]_r$ in radix $R = r^k$ as $[b_{m-1}, b_{m-2}, ..., b_0]_R$

The old address can be expressed in mixed radix B-R as $a = [b_{m-1}, b_{m-2}, ..., b_0]_R [b]_B$

Defining the step number as $SN = (b_{m-1} + b_{m-2} + ... + b_0) \bmod R$

Then, the bank index for old address is: $\text{BI} = (b + SN \cdot d) \bmod B$

The new bank address for old address is: $\text{BA} = a >> M = [a_{T-1} ..., a_{T-C}]_r$

The scheme is based on the mixed radix expression of the old address. It is easy to see that this memory mapping method can be implemented by a few XOR and shift operations

Algorithm 6 Scalable Iterative NTT Algorithm

Input: $\boldsymbol{a}$ denotes a vector of length N. d is the number of butterfly units. R denotes the radix of NTT.
Output: $\boldsymbol{A} = Scalable\_NTT(\boldsymbol{a})$

for $p = \log_R N - 1$ to 0 **do**
  $J \leftarrow R^p$
  if $J < d$ **then**
    for $k = 0$ to $N/(Rd) - 1$ **do**
      for $i = 0$ to $d/J - 1$ **do**
        for $j = 0$ to $J - 1$ **do**

$$\begin{bmatrix} A_0 \\ A_1 \\ \dots \\ A_{R-1} \end{bmatrix} = BF\left(\begin{bmatrix} a_{kRd+iRJ+j} \\ a_{kRd+iRJ+j+J} \\ \dots \\ a_{kRd+iRJ+j+(R-1)J} \end{bmatrix}\right)$$

        end for
      end for
    end for
  else
    for $k = 0$ to $N/(RJ) - 1$ **do**
      for $i = 0$ to $J/d - 1$ **do**
        for $j = 0$ to $d - 1$ **do**

$$\begin{bmatrix} A_0 \\ A_1 \\ \dots \\ A_{R-1} \end{bmatrix} = BF\left(\begin{bmatrix} a_{kRJ+id+j} \\ a_{kRJ+id+j+J} \\ \dots \\ a_{kRJ+id+j+(R-1)J} \end{bmatrix}\right)$$

        end for
      end for
    end for
  end if
end for
return $\boldsymbol{A}$

if the radix is power-of-2, which is much cheaper than other methods used in [XHY+20] [RMD+15]. In addition, it can support arbitrary radix NTT algorithm, conducing to non-radix-2 NTT hardware design. Taking 16 points radix-2 NTT with 2 parallel butterfly units as an example, the detailed mapping process is described in Figure 7. At stage 0 ($p = 2$), the 4 parallel data points in group 0 round 0 ($G_{2,0,0}$) and group 1 round 0 ($G_{2,1,0}$) are mapped onto 4 different banks $\{0, 1, 2, 3\}$ and $\{2, 3, 0, 1\}$, respectively. By following the memory mapping scheme ahead, readers should convince themselves that it also holds valid for other computation stages and radice. The detailed mapping process for 27 points radix-3 in-place NTT is also depicted in Figure 14 of appendix.

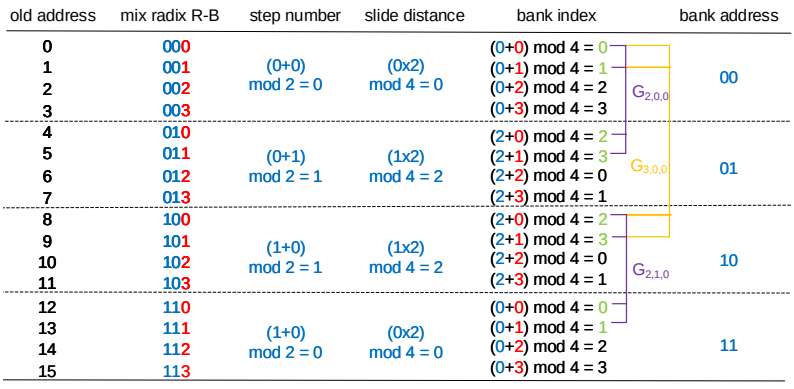


Figure 7: The detailed memory mapping scheme for 16 points radix-2 NTT with d = 2.

5 Scalable Radix-2/4 NTT Multiplication Architecture

5.1 The Overall Scalable Architecture

In this section, we propose the scalable radix-2 and radix-4 NTT multiplication architecture which supports configuration for vector size N, modulus q and number of parallel butterfly units d. As shown in Figure 8, the overall architecture is composed of eight different modules. The address generator is mainly implemented by the counter and shift logic gates. The memory mapping unit consists of a few XOR logic gates and 4-to-1 or 2-to-1 multiplexers in radix-2 and radix-4 NTT, respectively. The arbiter module decodes the bank indexes as corresponding selection signals to control the path of three interconnect networks. The amount of fan-ins in radix-2 NTT interconnect network is as twice larger as that of the radix-4 NTT. Because, the number of banks in radix-2 NTT will double compared to radix-4 NTT under the same configuration of butterfly numbers. This difference will influence the performance between radix-2 and radix-4 NTT. In section 6.1, we will quantify this difference in detail. Another distinguishing feature is that the one-dimension butterfly unit in radix-2 NTT is extended in two-dimension array in radix-4 NTT, which elaborates the aforementioned difference in terms of bank number. The twiddle factors of NTT are precomputed and stored in a ROM in this architecture. Since we reuse the twiddle factors in both radix-2 and radix-4 NTT to obtain the radix-2 and radix-4 INTT, the total types of twiddle factors needs to be stored is just $N-1$ words, which is almost half amount of the state-of-the-art designs like [XHY+20] and [ZYC+20].

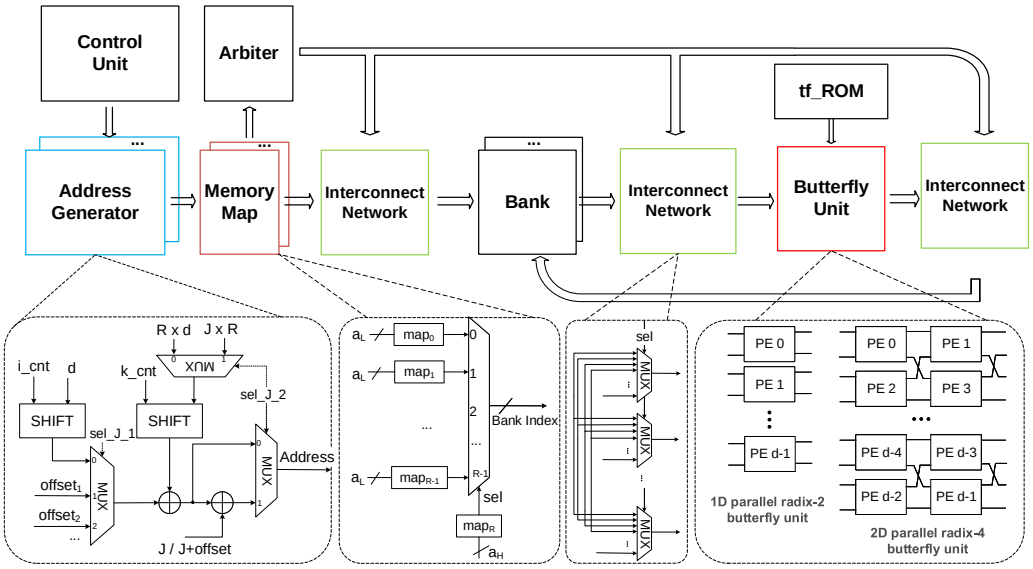


Figure 8: The scalable radix-2/4 NTT multiplication architecture.

5.2 Compact Radix-4 Butterfly Unit

As shown in section 3.3, the radix-4 butterfly unit is divided and scheduled into two-layer architecture to further reduce the computation complexity. In this section, we excavate the symmetric operator in radix-4 Cooley-Tukey and Gentleman-Sande butterfly units to reuse the hardware resource. It is observed that the IBFU1 needs an extra modular multiplication by 1/2 and the execution sequence is exactly on the contrary with BFU0.

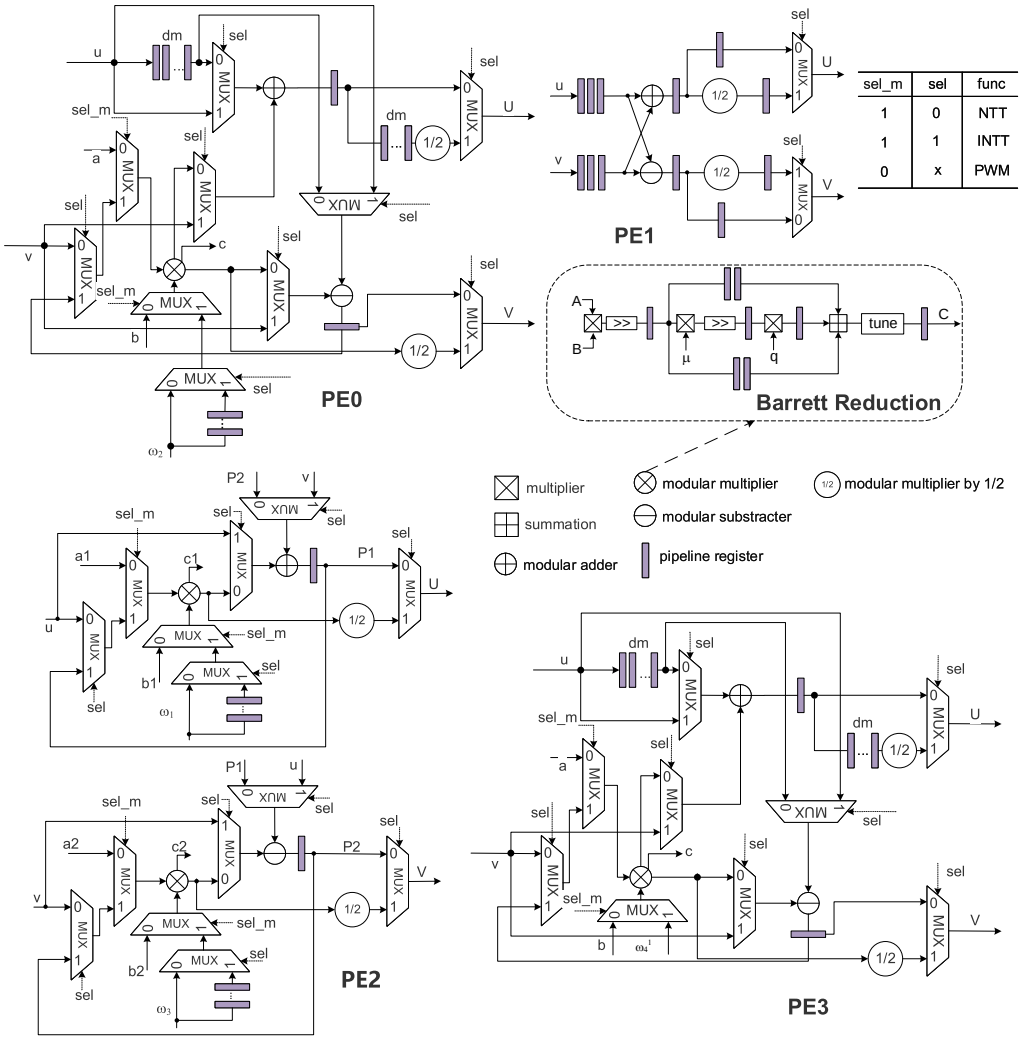


Figure 9: The compact architecture of radix-4 butterfly unit.

The butterfly unit pairs BFU1 and IBFU0, BFU2 and IBFU3, BFU3 and IBFU2 also have the similar difference. As a result, the DIT radix-4 NTT and DIF radix-4 INTT can be performed with 4 configurable processing elements. The Figure 9 depicts the specific architecture. When the selection signal *sel_m* is set to 1 and *sel* is set to 0 or 1, the four processing elements are configured to perform DIT NTT or DIF INTT operation, respectively. Furthermore, we also take the point wise multiplication (PWM) into consideration, which is performed by setting the signal *sel_m* to 1.

So far, we just need 4 modular adders, 4 modular substracters and 4 modular multipliers to implement the NTT/INTT butterfly operation and point wise multiplication. For parametric hardware design, Montgomery reduction and Barrett reduction are two commonly used methods. [BGV93] indicates that when the bit width of modulus is less than 32 bits, using Barrett reduction is more suitable. Thus, our modular multiplier follows Barrett reduction method as shown in Figure 9. The modular multiplier is designed with four pipeline stages and the critical path is the n-bit multiplication. The parameter μ is precomputed for configuration.

The Figure 10 shows the configurable routing structure in the processing element array. When the signal *sel_p* is set to 1, the PEs in the first column will receive the data points fetched from the banks and finish the fist-layer butterfly operation. The PEs in the second column will receive the computation result from the first-layer and perform the second-layer butterfly operation. When the signal *sel_p* is set to 0, the configuration is exactly the opposite. By applying this unified PE array, the hardware resource can be reduced by approximately 50% compared to the naive implementation. It is worth to mention that unifying the radix-8 or higher-radix NTT and INTT butterfly operation will be more difficult because the symmetric property of these operators is hard to excavate and the routing path will become more complicated.

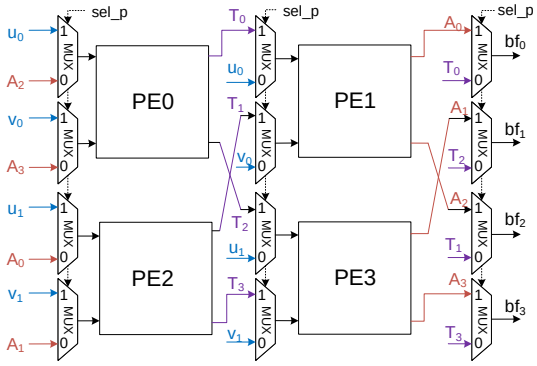


Figure 10: The routing structure of radix-4 PE array.

6 Implementation Results and Comparisons

The proposed architecture is designed with Verilog HDL and implemented on the 28 nm Xilinx Virtex-7 FPGA (xc7vx690tffg1761-3). The resource overheads and highest frequency are obtained from Vivado 2020.2 under the default strategy for synthesis and implementation. In section 6.1, we will make a performance evaluation between radix-4 and radix-2 NTT multiplication architecture through theoretical analysis and implementation results. In section 6.2, we will compare our implementation results with the state-of-the-art works.

6.1 Performance Evaluation Between Radix-4 and Radix-2 NTT

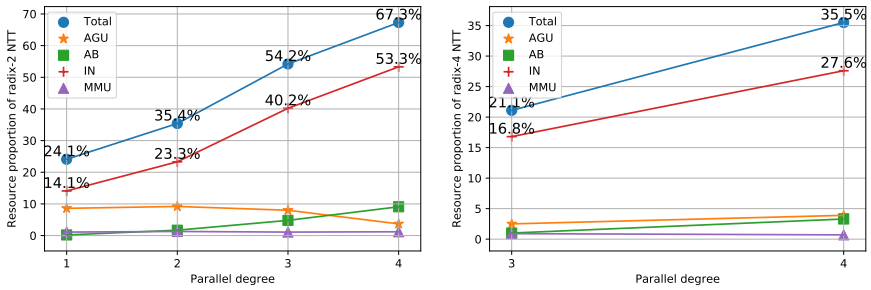
To justify the advantages of radix-4 NTT, we compare its area-time performance with radix-2 NTT through theoretical analysis and implementation results. Table 3 shows the theoretical difference between radix-2 and radix-4 NTT in terms of hardware resources about some common modules. It is observed that the radix-4 NTT consumes the same number of cycles with radix-2 NTT, but it only needs half number of banks when configured with the same number of butterfly units. The reason for this difference is that the radix-4 NTT can perform two consecutive layers of butterfly operations, which halves the concurrent data points to be fetched at every stage. This good balance between intra-stage and inner-stage parallelization can heavily reduce the number of fan-ins of interconnect network. As shown in Table 3, the number of fan-ins in interconnect network of radix-4 NTT is reduced by 91.6% compared to radix-2 NTT. In addition, the number of fan-ins in memory mapping units and address generator units of radix-4 NTT are both reduced by 75% and 50%, respectively.

Table 1: The theretical comparison between radix-2 and radix-4 NTT/INTT.

Type	AGU	MMU	AB	IN	Bank	BFU	TF ROM	NTT/INTT cycle
radix-2	2d	2d× 2-to-1 MUXs	2d× 2d-to-1 MUXs	6d× 2d-to-1 MUXs	2d	d× MA/MS/MM	$N-1$	$(N/2d)log_2N$
radix-4	d (↓ 50%)	d× 4-to-1 MUXs	d× d-to-1 MUXs (↓ 75%)	3d× d-to-1 MUXs (↓ 91.6%)	d (↓ 50%)	d× MA/MS/MM*	$N-1$	$(N/d)log_4N$

* : Multiplying ω_4^1 (ω_4^{-1}) can be alternatively replaced with modular additions.

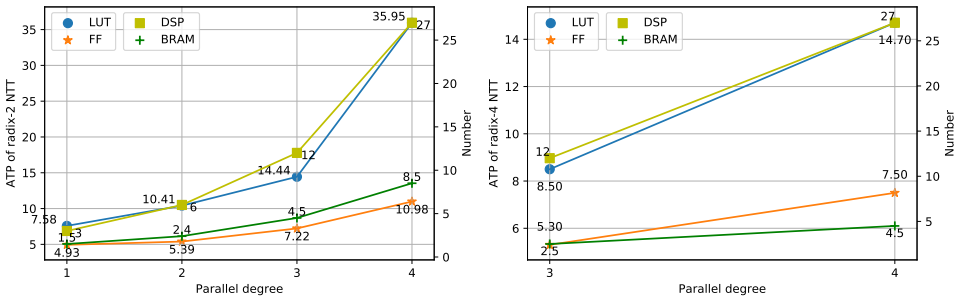
d : number of parallel butterfly unit **AGU** : address generator unit
MMU : memory mapping unit **IN** : interconnect network **AB** : Arbiter
BFU : butterfly unit **TF ROM** : twiddle factor ROM **MA** : modular adder
MS : modular substracter **MM** : modular multiplier



(a) radix-2 NTT (b) radix-4 NTT

Figure 11: The variation of resource proportion with parallel degree (N = 1024, 14-bit q)

The Figure 11 indicates the variation of resource proportion with the parallel degree on the FPGA platform. The parallel degree ranges from 1 to 4, which corresponds to the number of parallel butterfly units 1, 2, 4 and 8. From this figure, we can obtain two important facts. First, it is obvious that the resource proportion of the MMU, AB and IN modules will become larger when increasing the number of parallel butterfly units in both radix-2 and radix-4 NTT. Moreover, the resource proportion of interconnect network accounts for the main part among these four modules. Second, the growth rate of resource proportion is slower in radix-4 NTT than that of radix-2 NTT. In other words, the growth rate of the number of fan-ins in radix-4 NTT is almost twice lower than that of radix-4 NTT, which promotes the area-time efficiency in radix-4 NTT. The Figure 12 with dual coordinates depicts the comparisons of ATP index in terms of different FPGA resources. The left coordinate shows that the ATP of radix-4 NTT outperforms radix-2 NTT when configured with the same number of butterfly units. This advantage is enlarged with the growth of parallel degree. When setting the number of butterfly units to 8, the improvement of ATP index achieves almost 51.6%. Moreover, the radix-4 NTT configured with 4 butterfly units achieves the best balance between area and time. The right coordinate indicates how the number of DSP and BRAM varies with the parallel degree. Since the radix-2 and radix-4 butterfly units consume the same number of modular multiplication, the growth of DSP is identical as well. But the radix-4 NTT consumes less number of BRAMs.



(a) radix-2 NTT (b) radix-4 NTT

Figure 12: The variation of ATP with parallel degree (N = 1024, 14-bit q)

6.2 Comparisons with Related Work

Table 2 lists the key comparison results between related conflict-free memory mapping schemes and our proposed one. It is observed that the memory mapping scheme in this work can support the configuration for number of parallel butterfly units and arbitrary radix in-place NTT, which is more universe than the state-of-the-art scheme. This scheme can be implemented by simple XOR and shift logic gates as well. [XMX17] proposes a memory mapping scheme for constant geometry radix-2^k FFT supporting any number of butterfly units, which requires double memory overheads. [FLX20] also presents a general memory mapping scheme, but it will vary with the computation stage and entangle the pipelined design. Other schemes in Table 2 neither can backup the general FFT design nor consumes more hardware resources and memory footprint.

Table 2: Conflict-free memory mapping scheme comparisons with related work.

Scheme	Radix Config.	BFU Config.	FFT Type	Storage	Architecture	Hardware Resource
[Joh92]	√	×	IP	N	Memory-based	XOR+Shift
[XMX17]	√	√	CG	$2N$		XOR+Shift
[RV08]	√	√	IP	$N \log_R N$		LUT+Shift
[BUC19]	×	×	CG	$2N$		XOR+Shift
[FLX20]	×	√	SH	$2N$		Reorder+Shift
[RVM+14]	×	√	IP	N		-
[XWXY17]	√	√	IP	$2N$	Memory-MDC-based	XOR+Shift
This Work	√	√	IP	N	Memory-based	XOR+Shift

IP : in-place FFT. CG : constant geometry FFT. SH : Stockham FFT.

As shown in section 6.1, the radix-4 NTT with two-layer butterfly units owns the best ATP performance. We mainly compare its implementation results with the state-of-the-art works as depicted in Table 3. [ZYC+20] proposes a radix-2 NTT design with two parallel butterfly units. It cannot avoid the bit-reversed operation and consumes more than 2× cycles as our design. The ATP of LUT is competitive with this work. Since it proposes a fixed architecture for a specific modulus 12289, the ATP of FF and DSP is smaller than ours. However, owing to reusing the twiddle factors in NTT and INTT, our architecture achieves almost 3.9× improvement in terms of BRAM ATP. [FS19] presents a radix-2 NTT design with a single butterfly unit. It consumes less BRAMs but the ATP of LUT, FF and DSP is approximately 4.8×, 3.1× and 13.9× as our work, respectively. [BUC19] puts forward a constant geometry radix-2 NTT with two parallel butterfly units as well. This

design targets at power-efficiency and supports multiple modulus. Therefore, it requires less FFs but the ATP of LUT, DSP and BRAM is almost 22.8×, 3.6× and 20.2× as our design, respectively. A fast and configurable radix-2 NTT is proposed in [JGCS19]. However, it needs extra cycles to execute the bit-reversed operation, pre-processing and post-processing. The ATP of LUT and DSP is near to our work but the ATP of FF and BRAM is almost 2.3× and 59.4× as our design, respectively. [XL20] presents a constant geometry radix-2 NTT architecture based on 4 parallel butterfly units. However, it consumes more memory overheads and computational cycles. The ATP of LUT, FF is approximately 3.1×, 3.0× as our design. Because the modular multiplier is specific for the modulus 12289, thus it consumes less DSPs as our design. [KLC+17] also puts forward a parallel radix-2 NTT architecture with 4 butterfly units. However, it cannot avoid the pre-processing and post-processing and thus needs extra more cycles. Its modular multiplier is based on a fixed Barrett reduction method for 12289. The ATP of LUT, FF, DSP and BRAM is almost 5.8×, 4.5×, 1.8× and 10.7× as our work, respectively. [MKO+20a] proposes the highly parallel radix-2 NTT with 32 butterfly units, which results in less computational cycles. Nonetheless, the high fan-out and fan-in in this architecture may pull down the maximum frequency and it does not reuse the twiddle factors. Therefore, the ATP of LUT, DSP and BRAM is nearly 3.2×, 1.97× and 4.7× as our architecture. A two-layer radix-2 in-place NTT design based on high-level synthesis method is also presented in [NDG19]. But the tricks of reusing twiddle factor and radix-4 butterfly operator are not applied in this design. It also consumes more cycles to compute NTT. As a result, the ATP of LUT, FF and BRAM is approximately 1.1×, 2.3× and 6.6× as our work.

Table 3: NTT comparisons with related work.

Work	BFU	Cycles	Freq. (MHz)	Time. (μs)	LUT/ ATP	FF/ ATP	DSP/ ATP	BRAM/ ATP
parameters: N = 1024, fixed modulus q = 12289								
[ZYC+20]^{A}	2	2569*	244	10.5	847/8.9	375/3.9	2/21.1	6/63.2
[FS19]^{A}	1	10240	-	-	980/41.1	395/16.6	26/1091	2/83.9
[BUC19]^{A}	2	6155	-	-	7690/194	16/0.4	11/277.5	13/327.9
[JGCS19]^{A}	1	6206*	251	24.7	343/8.5	493/12.2	3/74.2	6/148.4
[XL20]^{Z}	4	2688	153	5.52	4823/26.6	2901/16.0	8/44.2	-
[KLC+17]^{Z}	4	2616*	150	17.44	2832/49.4	1381/24.1	8/139.5	10/174.4
parameters: N = 1024, tunable 14-bit modulus q								
[MKO+20a]^{Z}	32	200*	125	1.6	17188/27.5	-	96/153.6	48/76.8
[NDG19]^{Z}	2×2	2032	188	10.81	898/9.7	1117/12.1	4/43.24	10/108.1
This work^{V}	2×2	1295	200	6.5	1308/8.5	824/5.3	12/78	2.5/16.25
	4×2	655	135	4.7	3139/14.7	1595/7.5	27/126.9	4.5/21.15
	1	5125	242	21	461/9.6	235/4.9	3/63	1.5/31.5
	2	2565	232	11	946/10.4	490/5.4	6/66	2.5/27.5
	4	1285	192	6.7	2155/14.4	1078/7.2	12/80.4	4.5/30.15
	8	645	117	5.5	6537/35.9	1997/11	27/148.5	8.5/46.75

* : The cycles for bit-reversed operation are not included.

A : Artix-7 FPGA platform. V : Virtix-7 FPGA platform. Z : Zynq-7000 FPGA platform.

7 Conclusion

In this paper, we propose a scalable radix-2 and radix-4 NTT multiplication architecture based on an efficient memory mapping scheme. The detailed derivation process for bit-reversed-free radix-4 NTT and INTT with low complexity is provided. Both algorithm-level and architecture-level optimization techniques are applied to reduce the area overheads and memory footprint in our design. Through theoretical analysis and implementation results, we point out that the proposed radix-4 NTT-based architecture with the same number of parallel butterfly units outperforms the radix-2 one in terms of area-time performance. This advantage is enlarged when increasing the parallel degree. In addition, the proposed memory mapping scheme can support the parallelization of arbitrary radix NTT, which is more universe and efficient than other methods. In the future, we will integrate the NTT core into the PQC or FHE cryptosystem to improve the overall performance. We will also consider the protective implementations for NTT core against the side channel attacks.

Appendix

By following the deduction process in section 3 and section 4, we can still obtain the radix-3 DIT-NR in-place NTT algorithm. The concrete dataflow of 27-points radix-3 DIT-NR NTT with three butterfly units is depicted in Figure 13. At every stage, 9 data points are accessed in parallel according to the growing group order. The lines with red, yellow and blue color represent the parallel butterfly operations in the first round of each stage, respectively.

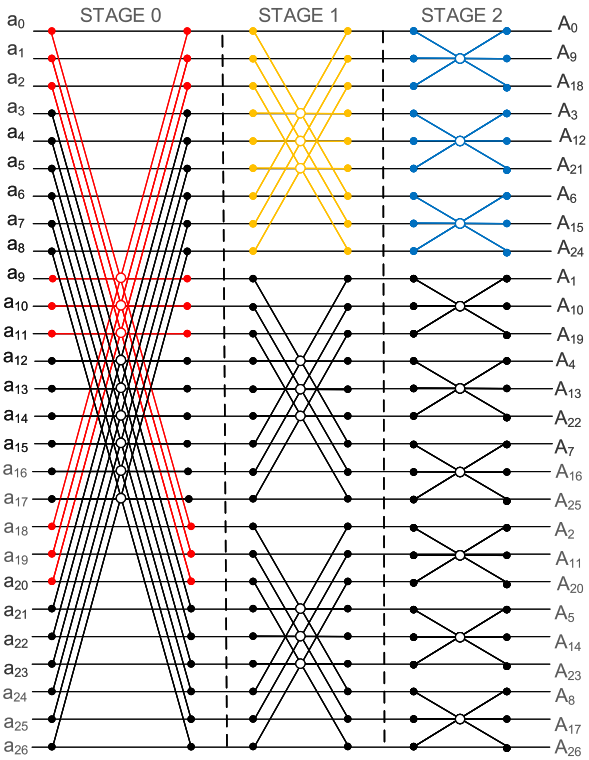


Figure 13: The dataflow of 27-points radix-3 DIT-NR NTT with d = 3.

The conflict-free memory mapping scheme proposed in section 4 is also valid for radix-3 in-place NTT. The detailed mapping process for 27 points radix-3 in-place DIT-NR NTT is also depicted in Figure 14. Taking stage 0 ($p = 2$) as an example, the nine old addresses $\{0, 9, 18, 1, 10, 19, 2, 11, 20\}$ in group 0 round 0 ($G_{2,0,0}$) are mapped onto nine desired different bank indexes $\{0, 1, 2, 3, 4, 5, 6, 7, 8\}$, respectively. By derivation, readers can find that other computation stages also go the same way as stage 0.

old address	mix radix R-B	step number	slide distance	bank index	bank address
0	00	0 mod 3 = 0	(0x3) mod 9 = 0	(0+0) mod 9 = 0	0
1	01			(0+1) mod 9 = 1	
2	02			(0+2) mod 9 = 2	
3	03			(0+3) mod 9 = 3	
4	04			(0+4) mod 9 = 4	
5	05			(0+5) mod 9 = 5	
6	06			(0+6) mod 9 = 6	
7	07			(0+7) mod 9 = 7	
8	08			(0+8) mod 9 = 8	
9	10	1 mod 3 = 1	(1x3) mod 9 = 3	(3+0) mod 9 = 3	$G_{2,0,0}$
10	11			(3+1) mod 9 = 4	
11	12			(3+2) mod 9 = 5	
12	13			(3+3) mod 9 = 6	1
13	14			(3+4) mod 9 = 7	
14	15			(3+5) mod 9 = 8	
15	16			(3+6) mod 9 = 0	
16	17			(3+7) mod 9 = 1	
17	18			(3+8) mod 9 = 2	
18	20	2 mod 3 = 2	(2x3) mod 9 = 6	(6+0) mod 9 = 6	2
19	21			(6+1) mod 9 = 7	
20	22			(6+2) mod 9 = 8	
21	23			(6+3) mod 9 = 0	
22	24			(6+4) mod 9 = 1	
23	25			(6+5) mod 9 = 2	
24	26			(6+6) mod 9 = 3	
25	27			(6+7) mod 9 = 4	
26	28			(6+8) mod 9 = 5	

Figure 14: The detailed memory mapping scheme for 27 points radix-3 NTT with d = 3.

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