



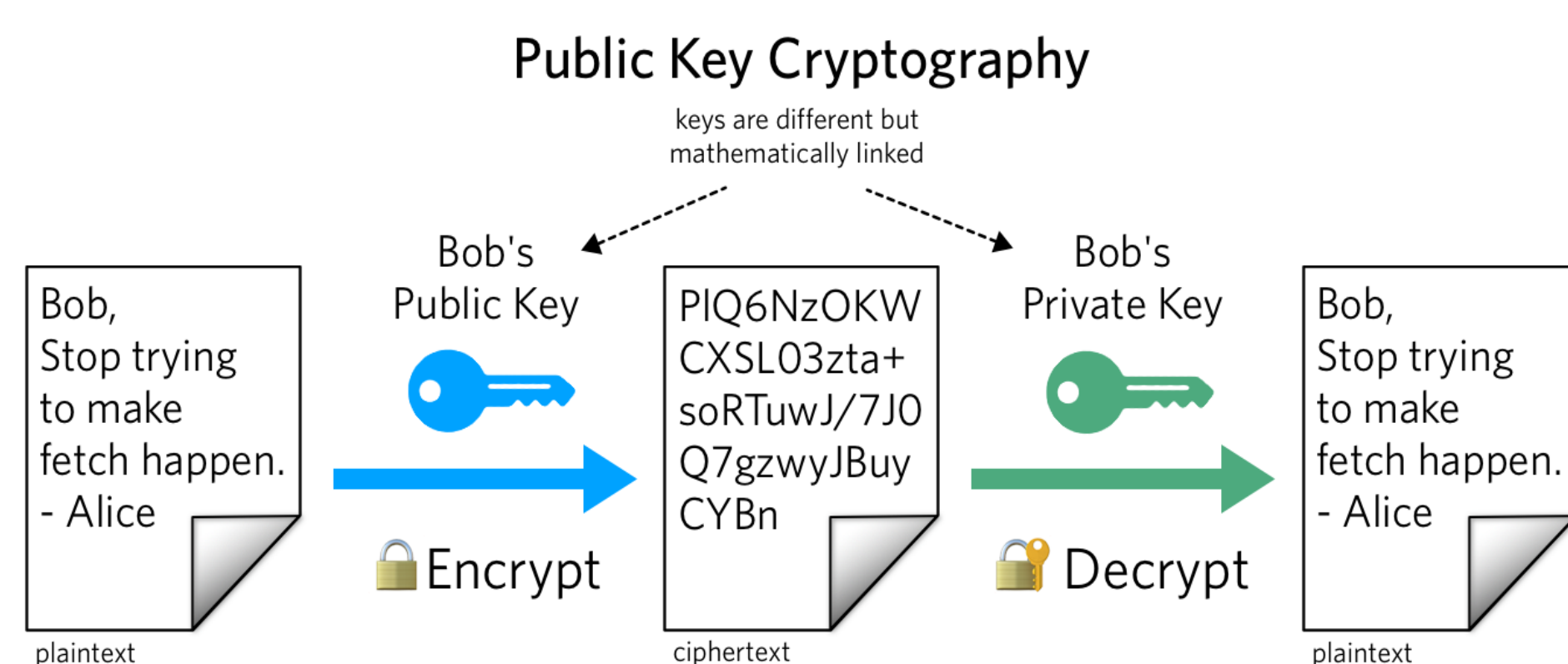
Interval Arithmetic FFT for Large Integer Multiplication

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Motivation

- Large integer multiplication has applications in:
 - Modular arithmetic routines in cryptographic systems
 - Number theoretic tasks in kernels
 - Computer algebra systems

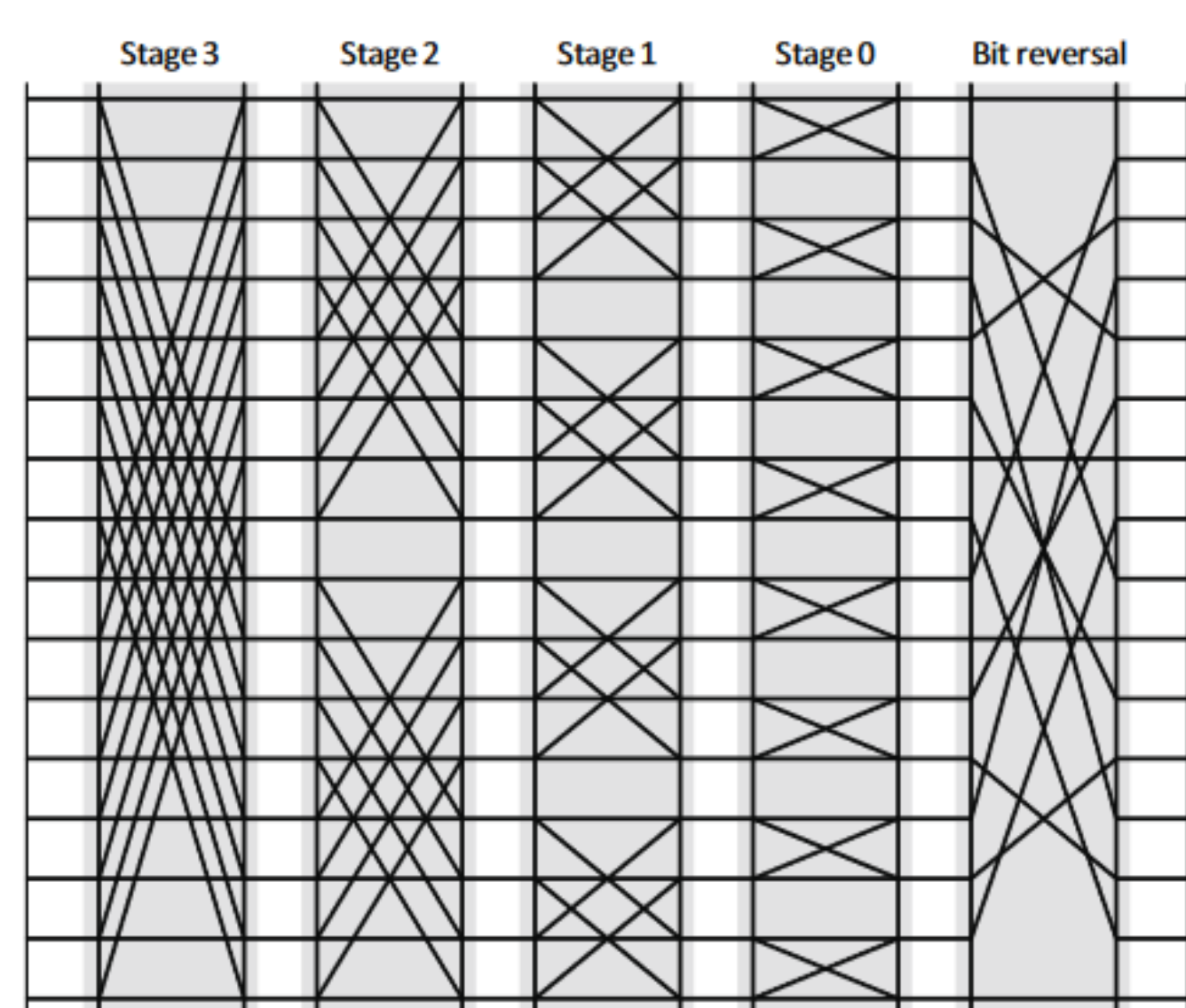


Computation complexity of naive multiplication: $O(N^2)$
Too slow and infeasible for these applications

Our Approach

Fast Fourier Transform (FFT) + Interval Arithmetic

- We perform our multiplication pipeline with FFT \rightarrow computation complexity $O(N \log N)$

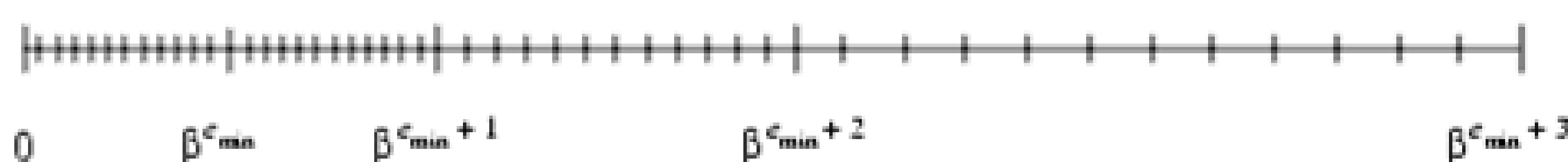


$$y[n] = \sum_{m=0}^{N-1} x_1[m]x_2[(n-m)_N] \xrightarrow{\text{DFT/IDFT}} Y[k] = X_1[k] \circ X_2[k]$$

$$12 \times 21 = [1, 2] * [2, 1] = [2, 5, 2]$$

$$12 \times 21 = \mathcal{F}^{-1}(\mathcal{F}[1, 2] \odot \mathcal{F}[2, 1]) = [2, 5, 2]$$

- **Pitfalls** \triangle : Complex FFTs lead to **round-off errors** associated with **floating point arithmetic**



- Interval Arithmetic to handle floating point round-off error

$$[x_1, x_2] + [y_1, y_2] = [x_1 + y_1, x_2 + y_2]$$

$$[x_1, x_2] \cdot [y_1, y_2] = [\min\{x_1y_1, x_1y_2, x_2y_1, x_2y_2\}, \max\{x_1y_1, x_1y_2, x_2y_1, x_2y_2\}]$$

Algorithm Interval-arithmetic FFT-based Integer Multiplication

Input: vector x and y of size N

Output: vector z of size $2N$

```

i1 ← ZeroPad(x)           ▷ zero padding to size of 2N
i2 ← ZeroPad(y)
f1 ← IntervalFFT(i1)
f2 ← IntervalFFT(i2)
prod ← Mul(f1, f2)       ▷ point-wise multiplication
raw_retv ← IntervalIFFT(prod)
z ← Carry(raw_retv)      ▷ Propagate carries

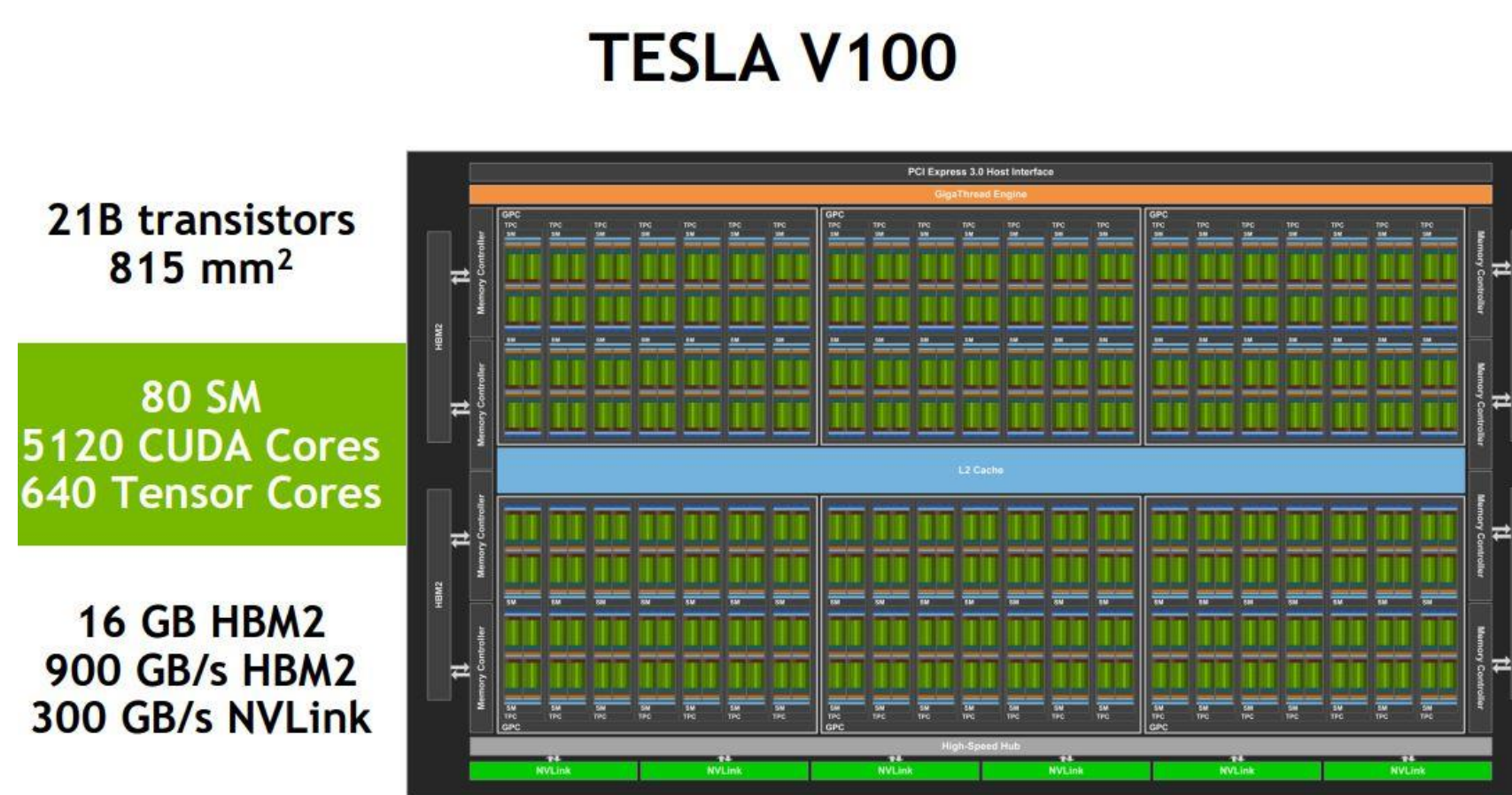
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Our Optimization in algorithm-level:

- **IntervalFFT** uses Decimation-in-frequency (DIF) and **IntervalIFFT** uses Decimation-in-time (DIT) \rightarrow avoid bit reversal operation
- Used Real FFT to help decrease the memory usage

Results

- We tested our algorithms on two platforms:
 - GPU (NVIDIA Tesla V100)
 - CPU (Intel Xeon E7-4850 v3)

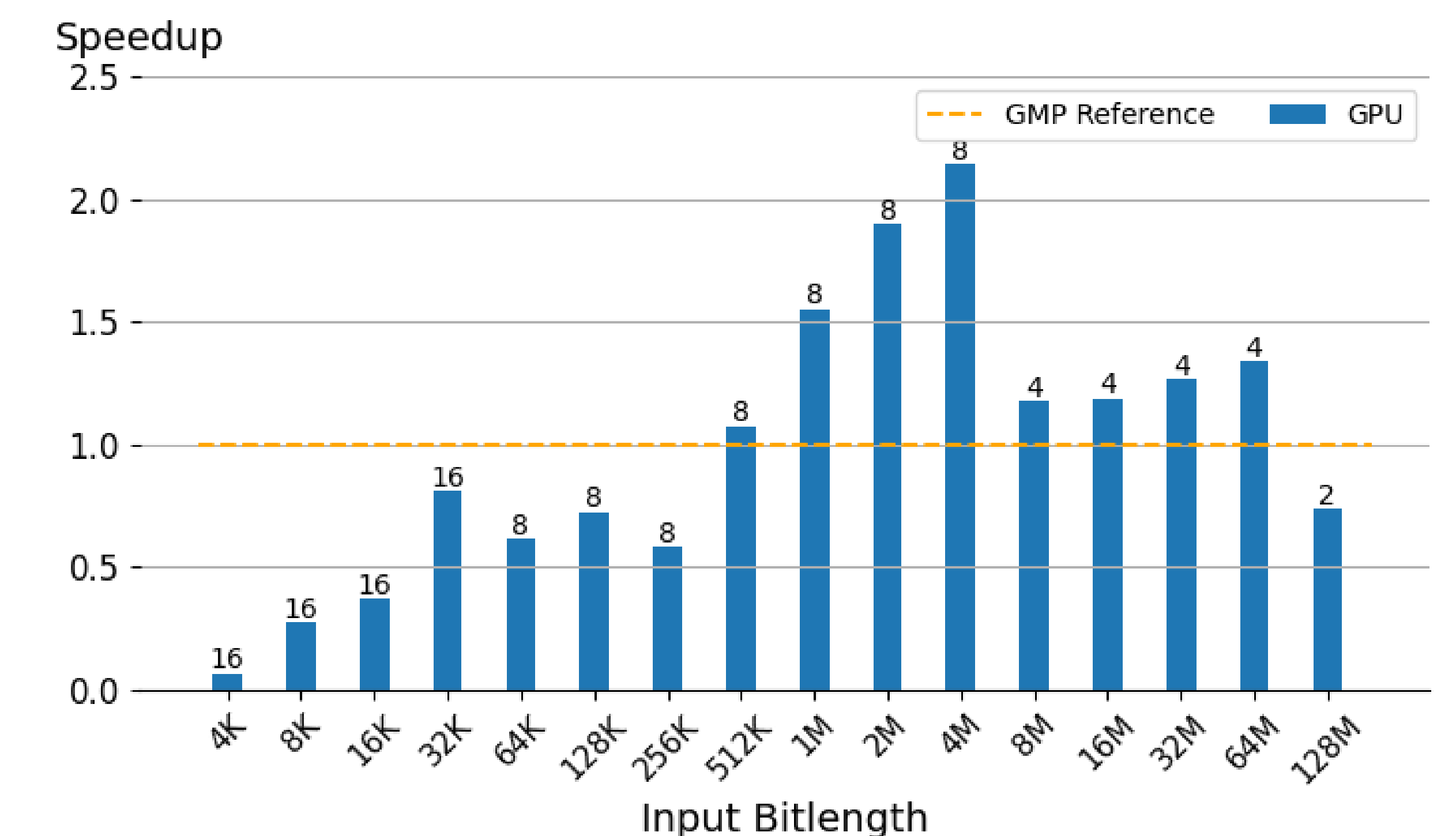
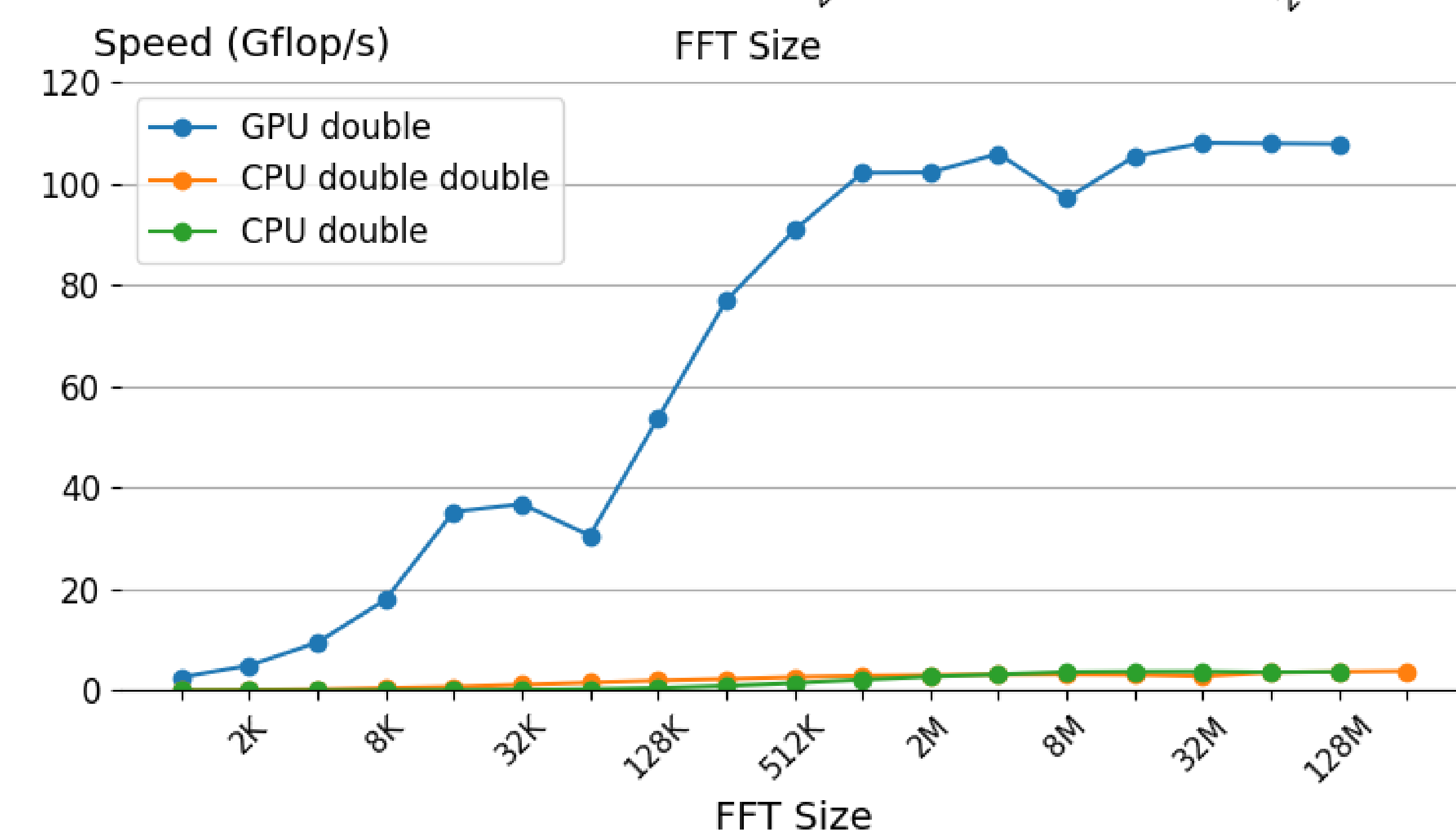
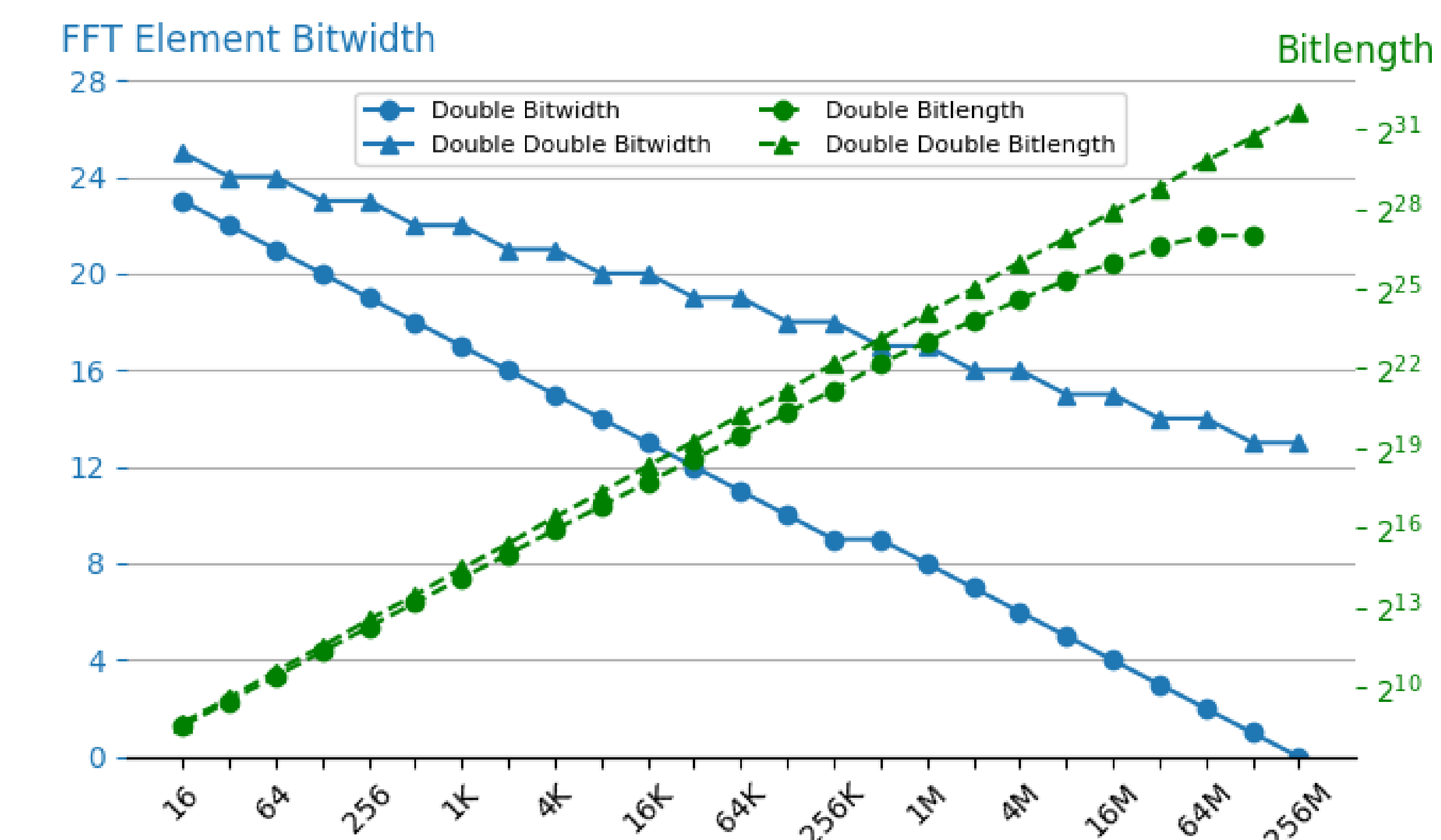


Our Optimization in software-level:

- Used double-double (128 bits floating point data type) to provide higher precision
- Packed up more bits for an element to lower the FFT size
- Used shared memory for GPU to decrease global memory accesses
- Used OpenMP for CPU to parallelize

Our Goal:

- Support multiplication of billions of digits input
- Achieve comparable or better performance in contrast with GMP



Future work

- We plan to use pruned FFTs to further decrease our memory usage and speed up our algorithm
- We plan to combine our algorithm with Karatsuba to help round-off errors
- We plan to use higher radix FFT in our algorithm