

# Fast Fourier Transform summary

**G. Fountoukidou, Prof. Ioannis Pitas**  
**Aristotle University of Thessaloniki**  
**[pitass@csd.auth.gr](mailto:pitass@csd.auth.gr)**  
**[www.aiia.csd.auth.gr](http://www.aiia.csd.auth.gr)**  
**Version 2.2.1**

# Fast Fourier Transform

- **DFT to FFT**
- Decimation in Time (DIT) FFT
- Decimation in Frequency (DIF) FFT
- FFT Computation issues
- Goertzel Algorithm
- Bluestein Algorithm

# Fast Fourier Transform

**Discrete Fourier Transform (DFT)** of a signal  $x(n)$ :

$$X(k) = \sum_{n=0}^{N-1} x(n)W_N^{nk},$$

- $N$  complex roots of unity:

$$W_N = e^{-i\frac{2\pi}{N}}, \quad W_N^N = 1.$$

**Inverse Discrete Fourier Transform (IDFT):**

$$x(n) = \frac{1}{N} \sum_{k=0}^{N-1} X(k)W_n^{-nk}.$$

# Fast Fourier Transform



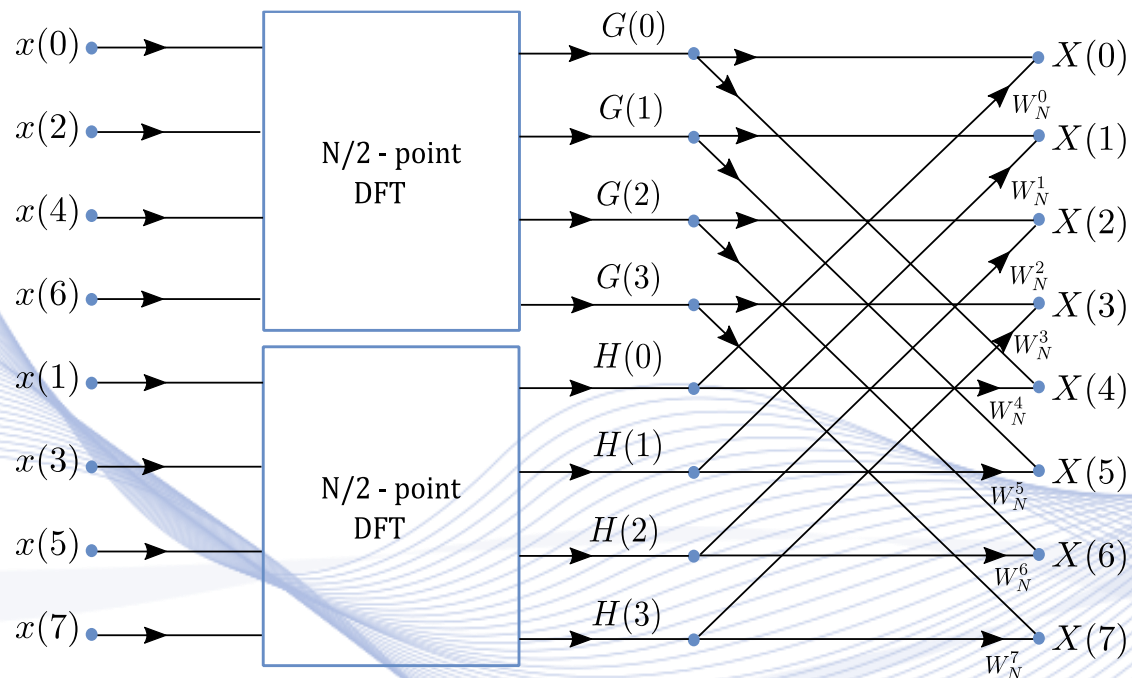
- DFT computation requires complex multiplications and additions.
- Each complex multiplication requires 4 real multiplications.
- DFT or IDFT computation by definition requires 2 for loops.
- Their computation complexity is  $O(N^2)$ .
- The most important advantage of DFT is that it can be calculated very fast using the ***Fast Fourier Transform (FFT)*** algorithm.



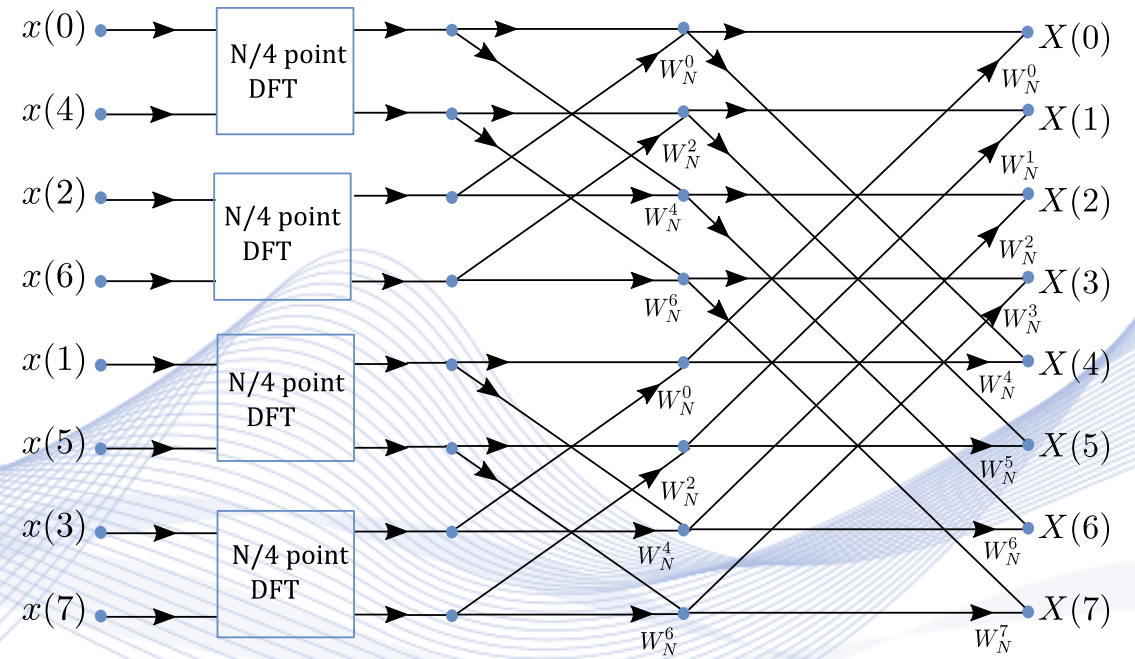
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# Decimation In Time FFT



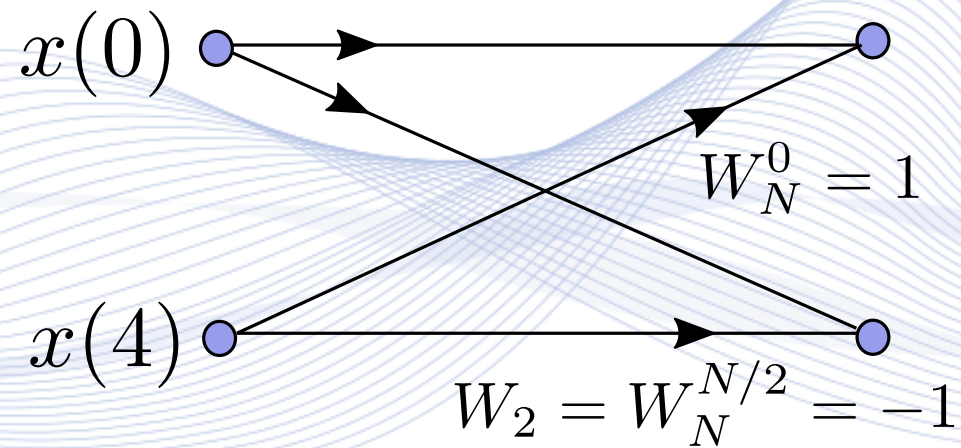
First FFT Stage for  $N = 8$ .



Second FFT Stage for  $N = 8$ .

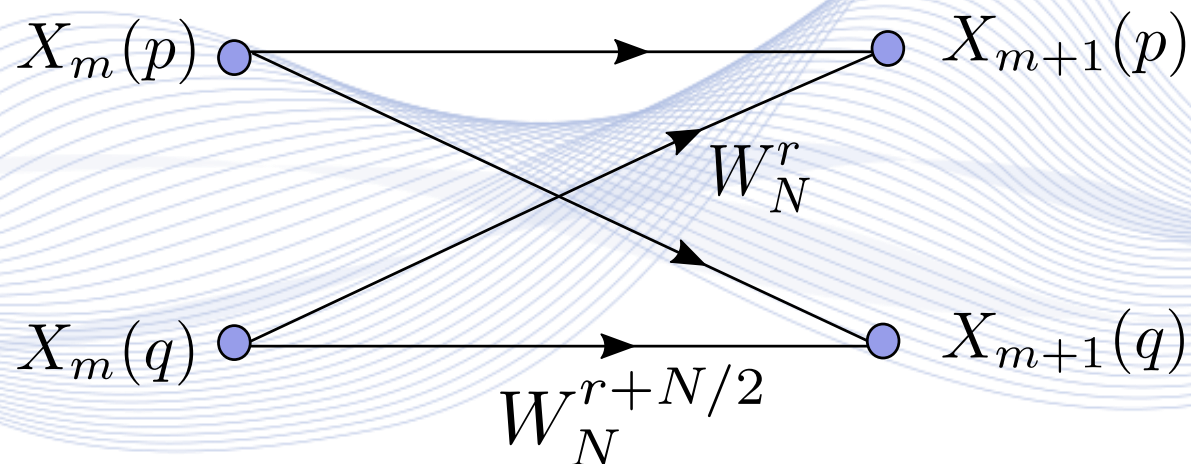
# Decimation In Time FFT

- This method results in the so-called ***Decimation in Time FFT (DIT FFT)***:
- This decimation process is continued, by breaking the calculation of the DFTs of length  $N/2$  into 4 DFTs of length  $N/4$ , etc., until we come to DFTs of length 2:



# Decimation In Time FFT

- Each stage consists of  $N/2$  basic computation structures called “*butterflies*”.
- Each butterfly has 2 complex multiplication and two complex additions.





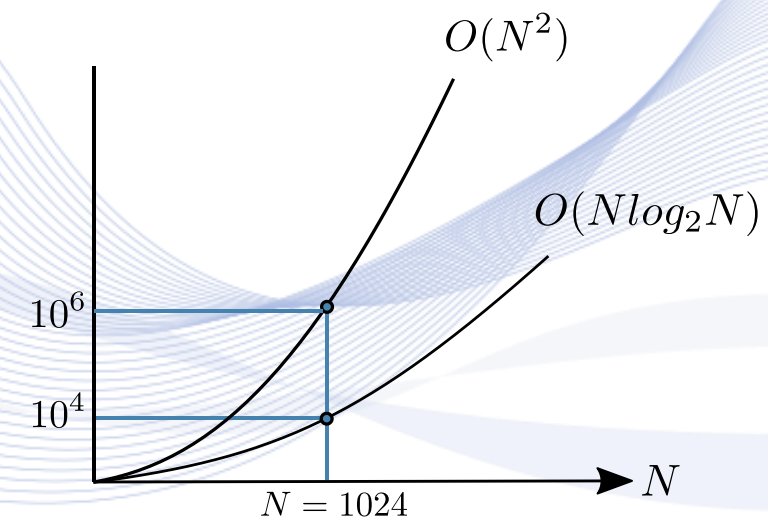
# Decimation In Time FFT

- DIT FFT has  $n = \log_2 N$  steps. Each step has  $\frac{N}{2}$  butterflies.
- Therefore, it requires a total of:

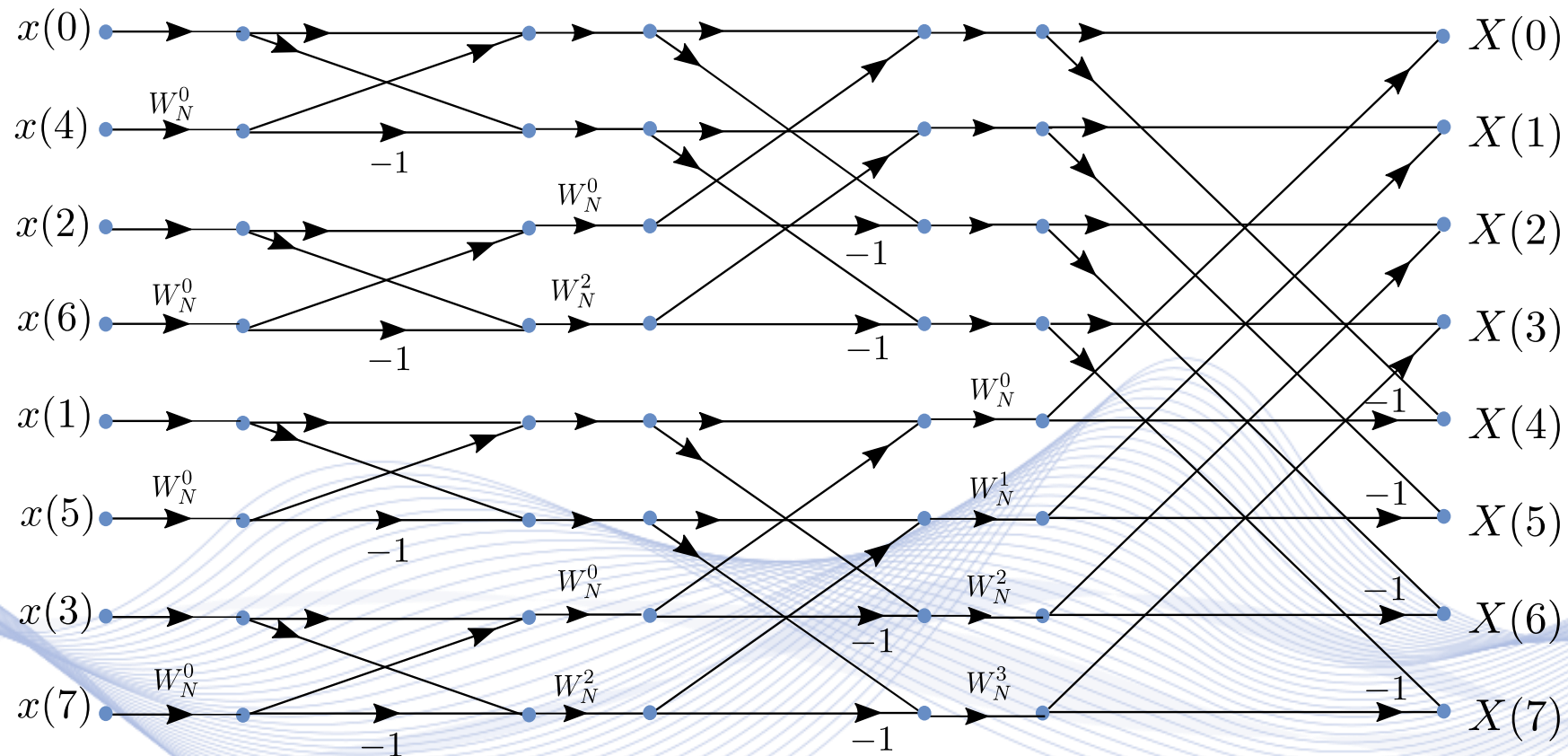
$$M = 2\left(\frac{N}{2}\right) \log_2 N = N \log_2 N .$$

complex multiplications and  $N \log_2 N$  complex additions.

- We already have a reduction in computational complexity from  $O(N^2)$  to  $O(N \log_2 N)$ .



# Decimation In Time FFT

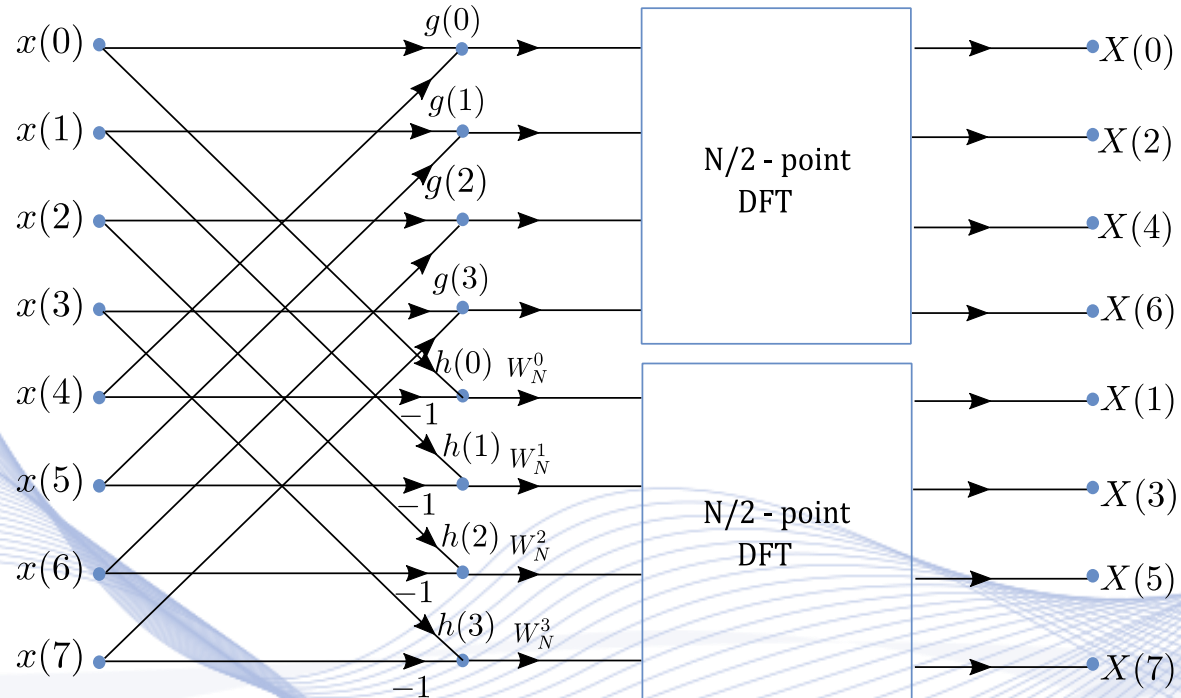


DIT FFT  $N = 8$ .

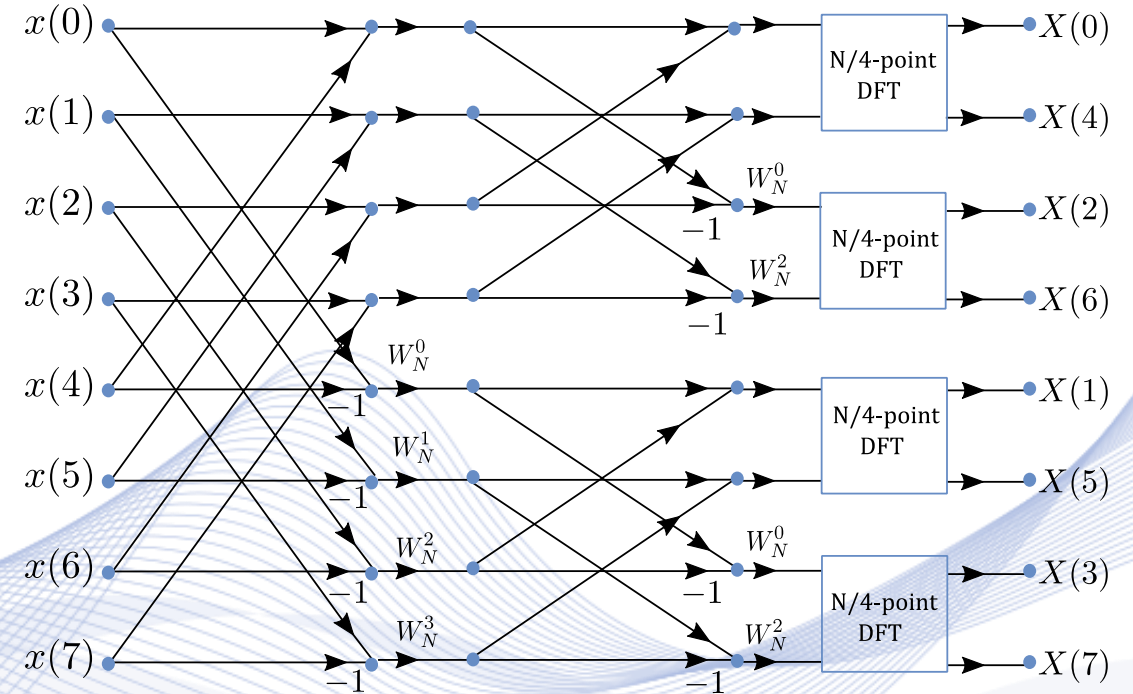
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# Decimation in Frequency FFT



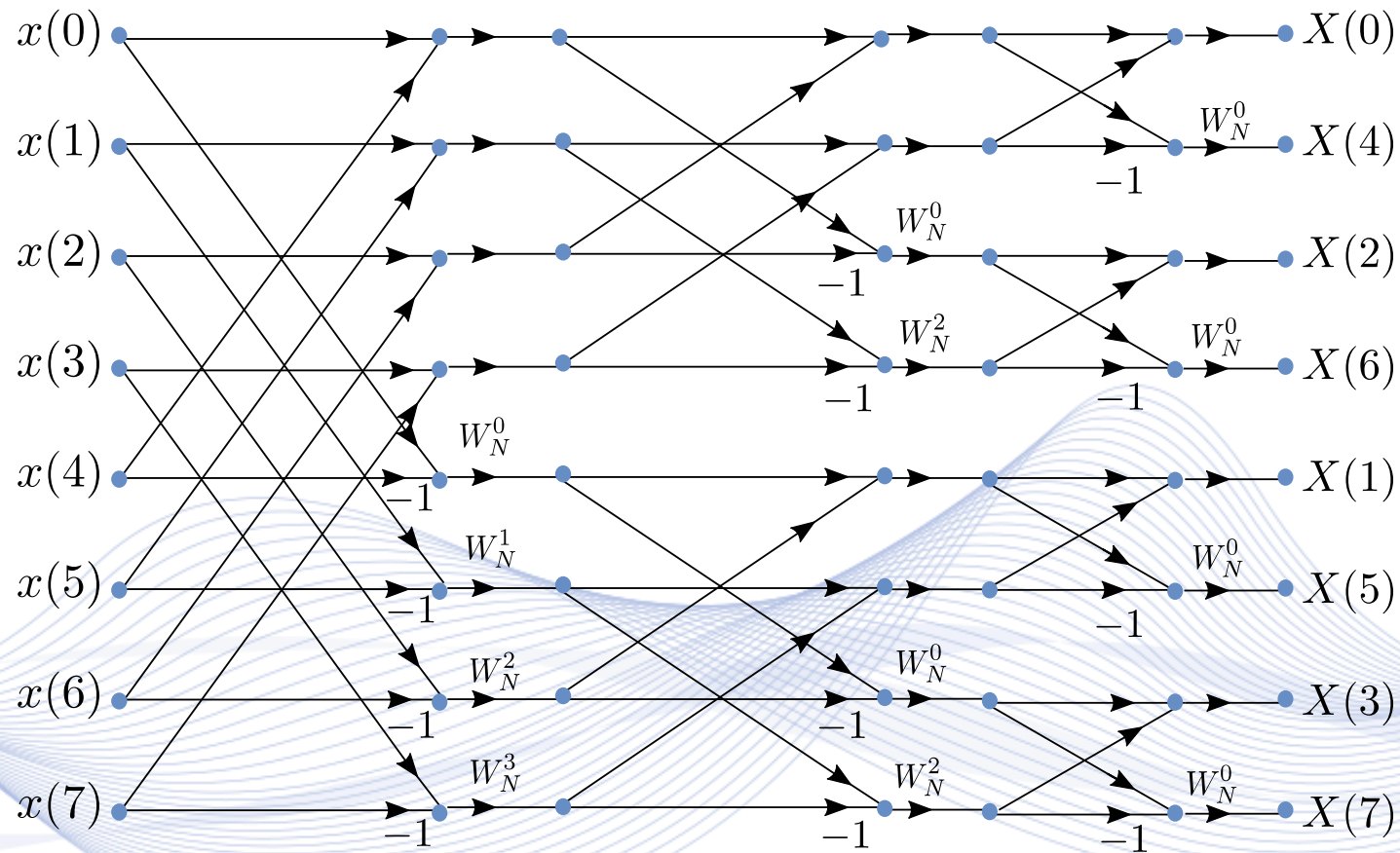
First DIF FFT stage  $N = 8$ .



Second DIF FFT stage  $N = 8$ .



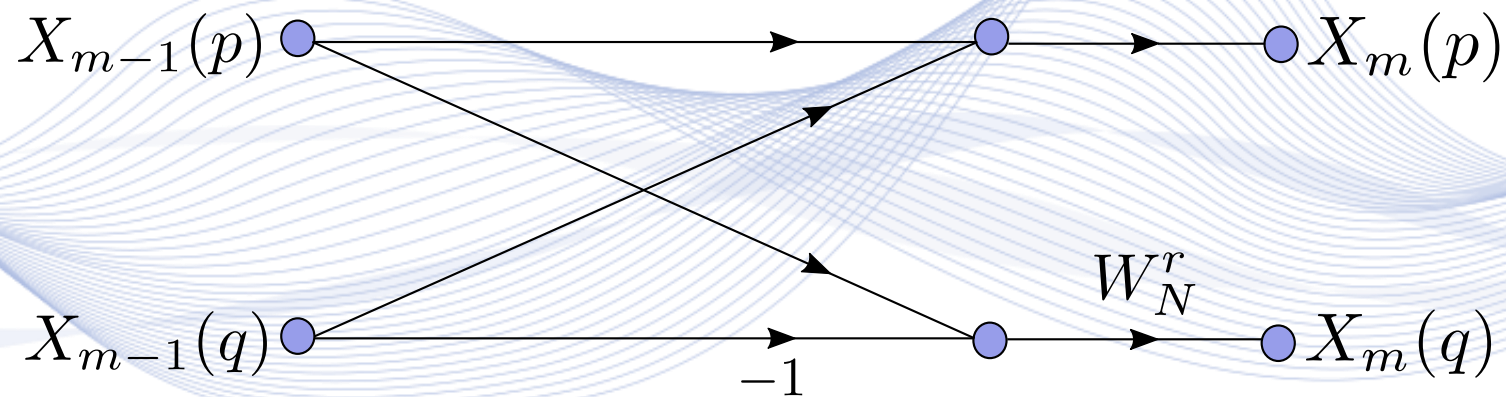
# Decimation in Frequency



Final DIF FFT stage  $N = 8$ .

# Decimation in Frequency FFT

- DIF FFT butterfly requires one complex multiplication and two complex additions.
- Therefore DIF FFT also requires  $N \log_2 N$  complex additions and  $(N/2) \log_2 N$  multiplications.



DIF FFT butterfly.

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# FFT Computation Issues

There are FFT algorithms for lengths different than a power of 2:

- **Radix 4 FFT** ( $N$  is power of 4),
- **Prime Factor Algorithm (PFA FFT):**
  - It calculates the DFT fast, if its length is a product of prime numbers:

$$N = p_1 p_2 \dots p_n.$$

- $p_1, p_2, \dots, p_n$  : co-prime integers.



# Fast Fourier Transform

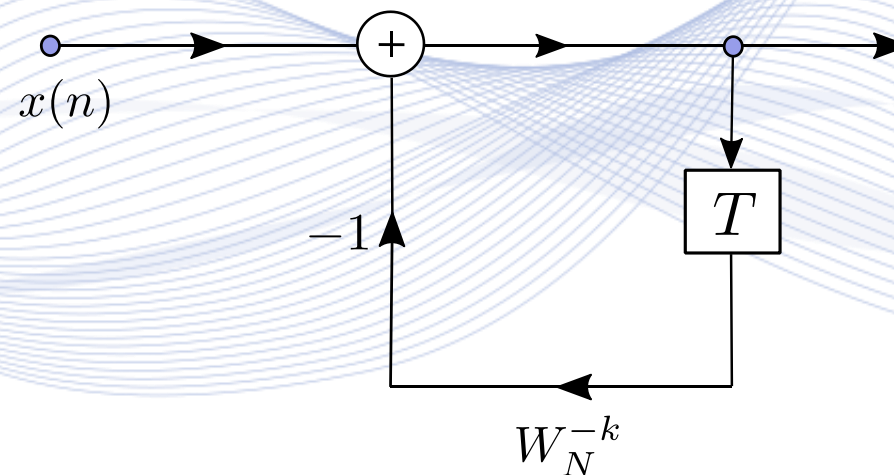
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# Goertzel Algorithm

The IIR filter that has such an impulse response is given by:

$$H_k(z) = \frac{1}{1 - W_N^{-k} z^{-1}}$$

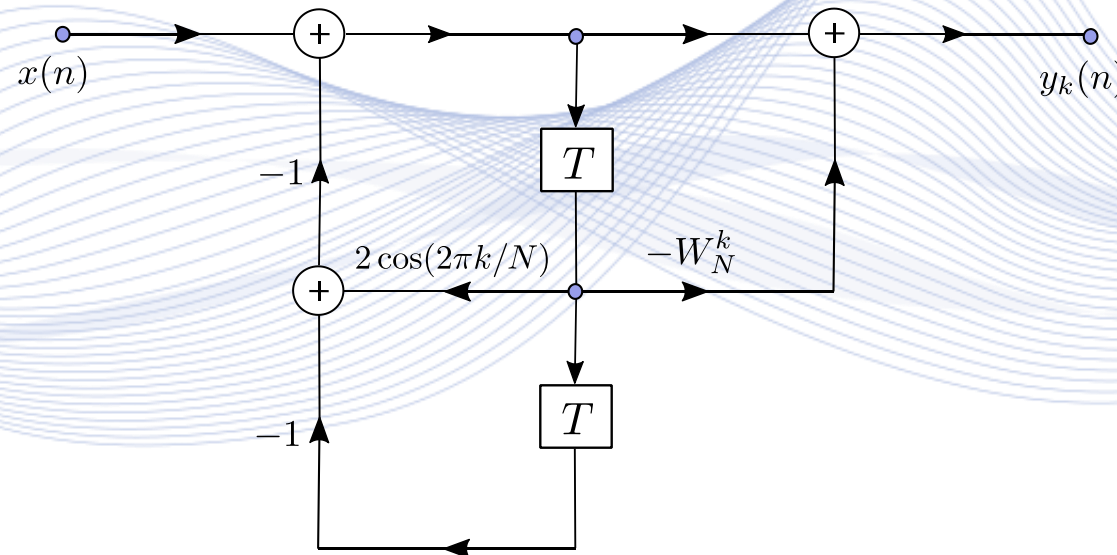
Therefore  $X(k)$  calculation can be done using the IIR filter structure:



# Goertzel Algorithm

An improved form of the **Goetzel filter** is given by the relation:

$$H_k(z) = \frac{1 - W_N^k z^{-1}}{(1 - W_N^{-k} z^{-1})(1 - W_N^k z^{-1})} = \frac{1 - W_N^k z^{-1}}{1 - 2 \cos\left(\frac{2\pi k}{N}\right) z^{-1} + z^{-2}}$$



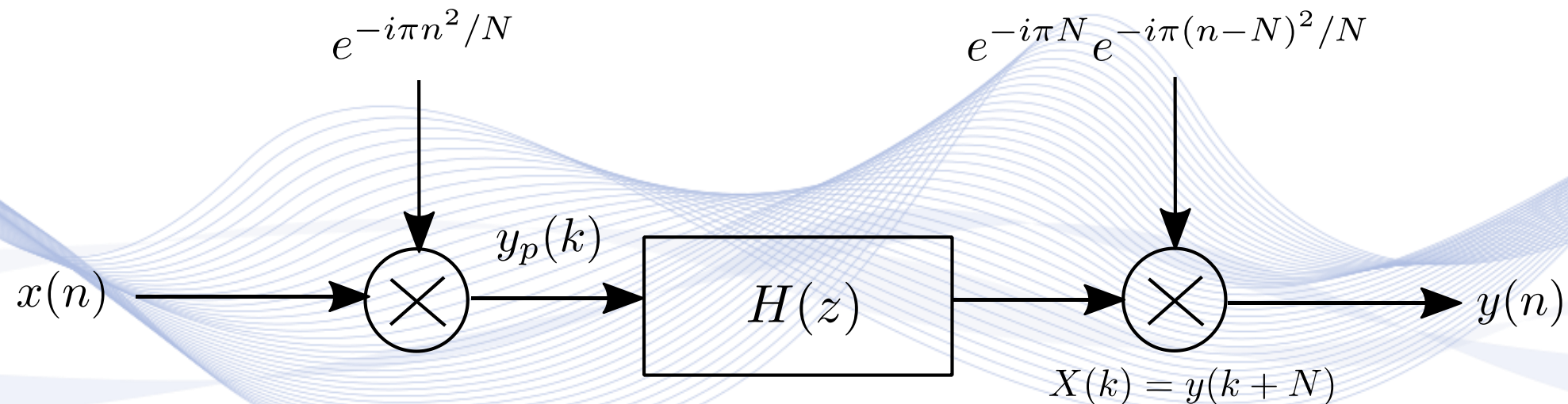
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# Bluestein Algorithm

If we input signal  $x(n)e^{-\frac{i\pi n^2}{N}}$  in the filter and multiply the output by  $e^{-i\pi N}e^{-\frac{i\pi(n-N)^2}{N}}$ , then the filter output is the DFT  $X(k)$ .



Bluestein filter structure.

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# Q & A

**Thank you very much for your attention!**

**More material in  
<http://icarus.csd.auth.gr/cvml-web-lecture-series/>**

**Contact: Prof. I. Pitas  
[pitass@csd.auth.gr](mailto:pitass@csd.auth.gr)**