

## CIRCULAR CONVOLUTION

Sequences of length  $N$  and the  $N$ -point DFT

$$\text{FFT}[x_1(n)] = X_1(k)$$

$$\text{FFT}[x_2(n)] = X_2(k)$$

$$\text{FFT}[x_3(n)] = X_3(k) = X_1(k)X_2(k)$$

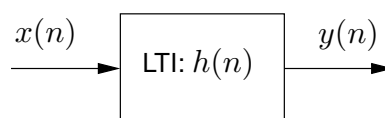
$\Leftrightarrow$

$$x_3(n) = \sum_{k=0}^{N-1} x_1(k)x_2((n-k)_{\text{mod } N}) = x_1(n) \circledast x_2(n)$$

**Notation:**  $x_1(n) \circledast x_2(n)$ , circular convolution of length  $N$ .



## LINEAR FILTERING USING FFT



$$y(n) = x(n) * h(n)$$

$$Y(f) = X(f)H(f)$$



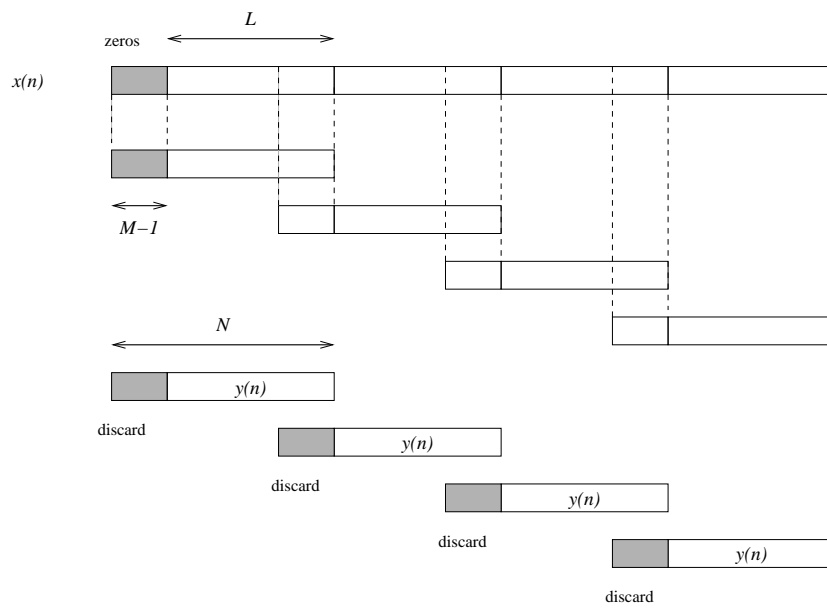
The FFT algorithm can be used to calculate  $y(n)$  very **efficiently**.

Problem:  $X(k)H(k)$  corresponds to **circular convolution**.

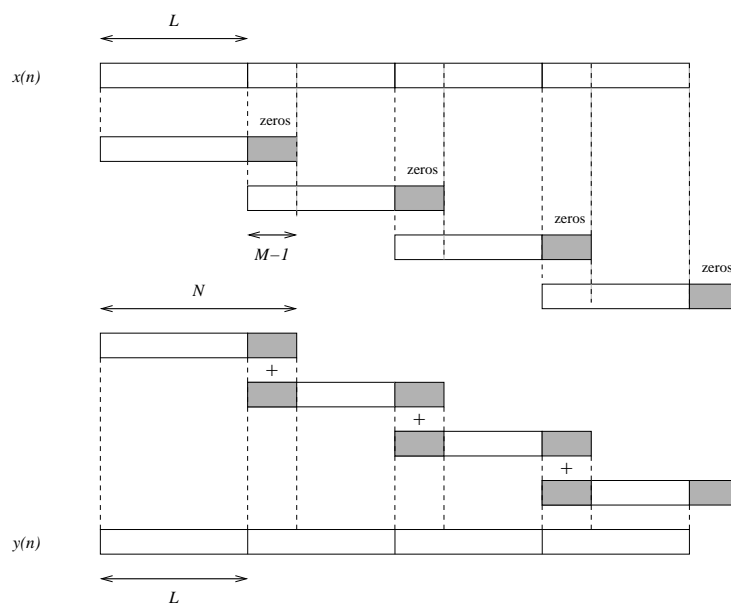
Set  $N \geq \text{length}\{h(n)\} + \text{length}\{x(n)\} - 1$  to avoid aliasing from the circular convolution.

Long input sequences are divided into segments, using **overlap-save** or **overlap-add**.

# OVERLAP-SAVE



# OVERLAP-ADD



## COMPUTATIONS

Computational complexity of overlap-save and overlap-add:  
(filter length:  $M$ )



$$\frac{N \log_2(2N)}{N - M + 1} \text{ multiplications per sample}$$

Direct implementation:

$$M \text{ multiplications per sample}$$

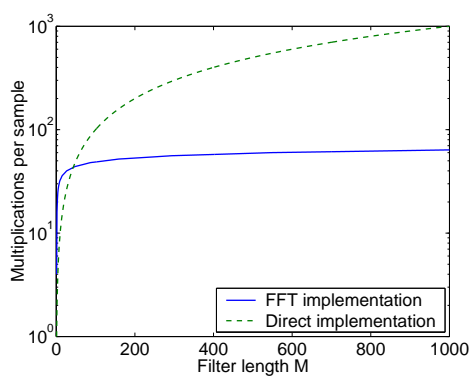
## COMPUTATIONS (CONT.)

There is an optimal value of  $N = 2^p$  for each filter length  $M$ :

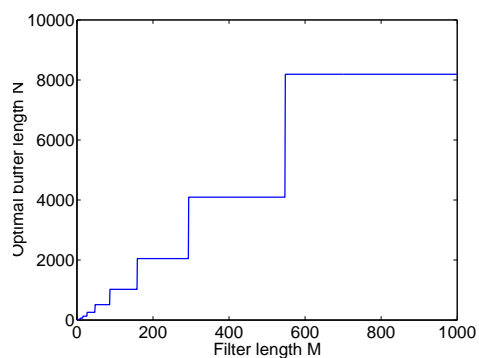
M	N	mult./sample
5	16	6.67
10	64	8.15
15	64	8.96
20	128	9.39
50	512	11.06
100	1024	12.18
1000	8192	15.94



## COMPUTATIONS (CONT.)



Number of multiplications.



Optimal FFT length.