

Chapter 16
Adaptive Filters

Learning Objectives

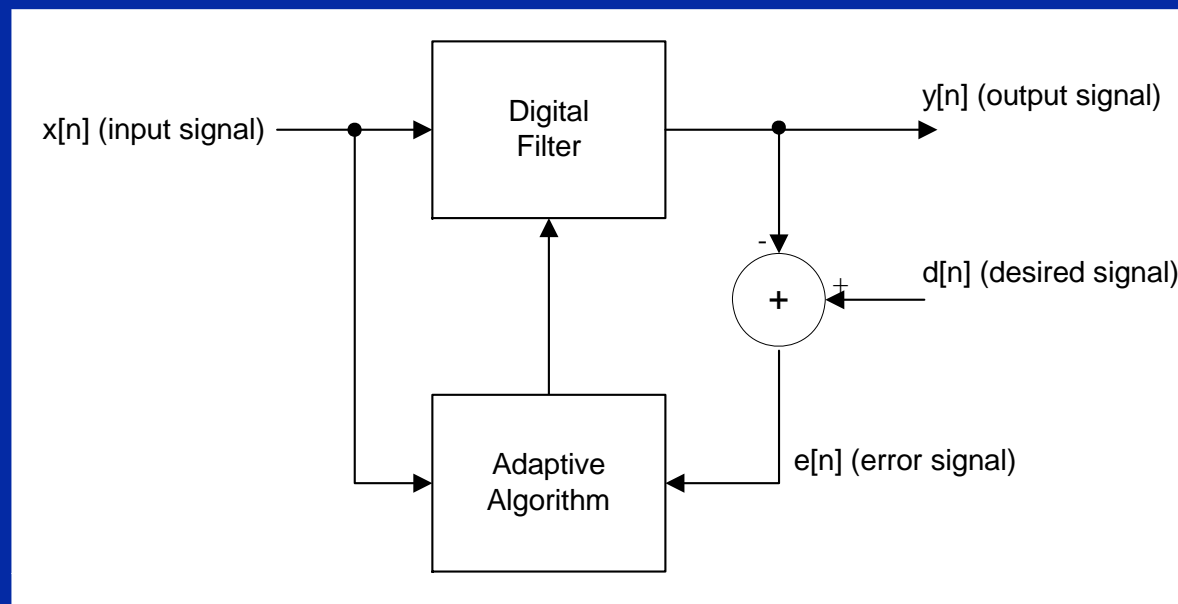
- ◆ **Introduction to adaptive filtering.**
- ◆ **LMS update algorithm.**
- ◆ **Implementation of an adaptive filter using the LMS algorithm.**

Introduction

- ◆ **Adaptive filters differ from other filters such as FIR and IIR in the sense that:**
 - ◆ **The coefficients are not determined by a set of desired specifications.**
 - ◆ **The coefficients are not fixed.**
- ◆ **With adaptive filters the specifications are not known and change with time.**
- ◆ **Applications include: process control, medical instrumentation, speech processing, echo and noise calculation and channel equalisation.**

Introduction

- ◆ **To construct an adaptive filter the following selections have to be made:**
 - ◆ **Which method to use to update the coefficients of the selected filter.**
 - ◆ **Whether to use an FIR or IIR filter.**



Introduction

- ◆ **The real challenge for designing an adaptive filter resides with the adaptive algorithm.**
- ◆ **The algorithm needs to have the following properties:**
 - ◆ **Practical to implement.**
 - ◆ **Adapt the coefficients quickly.**
 - ◆ **Provide the desired performance.**

The LMS Update Algorithm

- ◆ The basic premise of the LMS algorithm is the use of the instantaneous estimates of the gradient in the steepest descent algorithm:

$$h_n(k) = h_{n-1}(k) + \beta \Delta_{n,k}$$

β = step size parameter

$\Delta_{n,k}$ = gradient vector that makes $H(n)$ approach the optimal value H_{opt}

- ◆ It has been shown that (Widrow and Stearns, 1985):

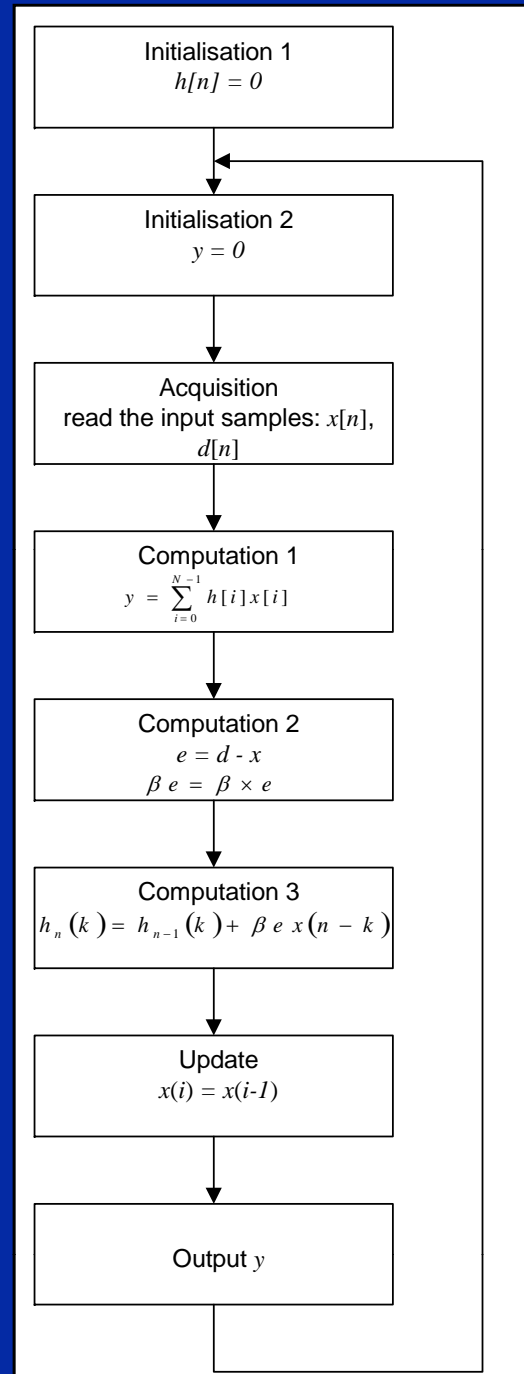
$$\Delta_{n,k} = e(n)x(n-k)$$

$e(n)$ is the error signal, where: $e(n) = d(n) - y(n)$

- ◆ Finally:

$$h_n(k) = h_{n-1}(k) + \beta e(n)x(n-k)$$

LMS algorithm Implementation



LMS algorithm Implementation

```
temp = MCBSP0_DRR; // Read new sample x(n)

X[0] = (short) temp;
D = X[0]; // Set desired equal to x(n) for this
// application

Y=0;

for(i=0;i<N;i++)
    Y = Y + ((_mpy(h[i],X[i])) << 1) ; // Do the FIR filter

E = D -(short) (Y>>16); // Calculate the error
BETA_E =(short)((_mpy(beta,E)) >>15); // Multiply error by step size parameter

for(i=N-1;i>=0;i--)
{
    h[i] = h[i] +((_mpy(BETA_E,X[i])) >> 15); // Update filter coefficients
    X[i]=X[i-1];
}

MCBSP0_DXR = (temp &0xffff0000) | (((short)(Y>>16))&0x0000ffff); // Write output
```


Adaptive Filter Code

◆ Code location:

- ◆ `\Code\Chapter 16 - Adaptive Filter\`

◆ Projects:

- ◆ Fixed Point in C: `\Lms_C_Fixed\`
- ◆ Floating Point in C: `\Lms_C_Float\`
- ◆ Fixed Point in Linear Asm: `\Lms_Asm_Fixed\`

◆ Further reading:

- ◆ Widrow and Stearns, 1985...

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