

SNS COLLEGE OF TECHNOLOGY

Coimbatore – 35

#### **An Autonomous Institution**



Accredited by NBA – AICTE and Accredited by NAAC – UGC with 'A++' Grade Approved by AICTE, New Delhi & Affiliated to Anna University, Chennai

#### DEPARTMENT OF ELECTRONICS AND COMMUNICATION ENGINEERING

16EC401 / Wireless Communication

IV ECE/ VII SEMESTER

#### Unit IV - MULTIPATH MITIGATION TECHNIQUES

Topic 3: Zero forcing Algorithm, LMS Algorithms



Algorithms for Adaptive Equalization



Practical considerations for choice of an equalizer structure and its algorithm

The cost of the computing platform (affordable or not?)

 Especially when used in user equipments

 The power budget (power limited applications or else?)

 In portable radio applications, battery drain at the subscriber unit is a paramount consideration

 The radio propagation characteristics (fast fading & time

delay spread?)

•The speed of the mobile unit determines the channel fading rate and the Doppler spread, which is directly related to the coherence time of the channel

# Three basic equalization methods *Linear equalization (LE):*



Performance is not very good when the frequency response of the frequency selective channel contains deep fades.

*Zero-forcing algorithm* aims to eliminate the intersymbol interference (ISI) at decision time instants (i.e. at the center of the bit/symbol interval).

Least-mean-square (LMS) algorithm

*Recursive least-squares (RLS) algorithm* offers faster convergence, but is computationally more complex than LMS (since matrix inversion is required).



## zero-forcing algorithm



#### Criterion:

To force the samples of the combined channel and equalizer impulse response to zero at all but one of sample points in the tapped delay line filter. Disadvantage:

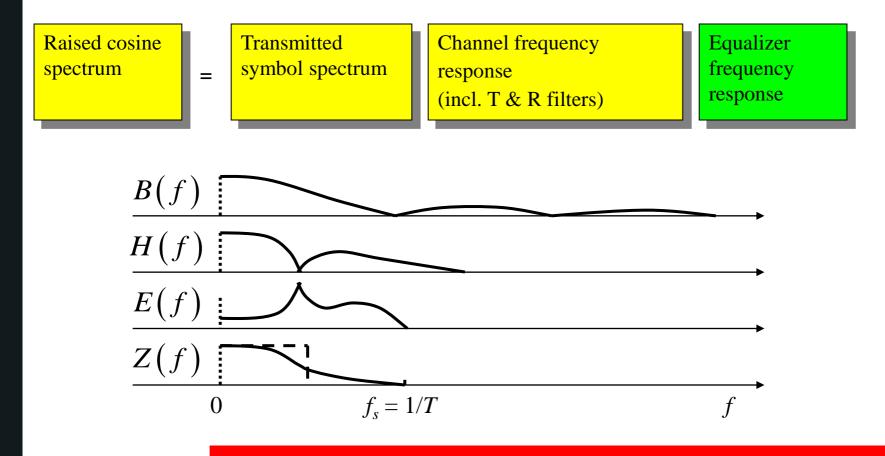
May excessively amplify noise at frequencies where the folded channel spectrum has high attenuation. Suitability: Wire line communications





## Linear equalization, zero-forcing algorithm

Z(f) = B(f)H(f)E(f)Basic idea:

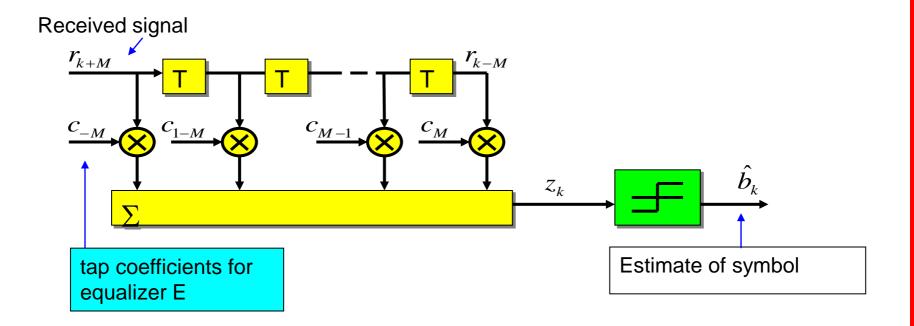




#### Zero-Forcing Equalization



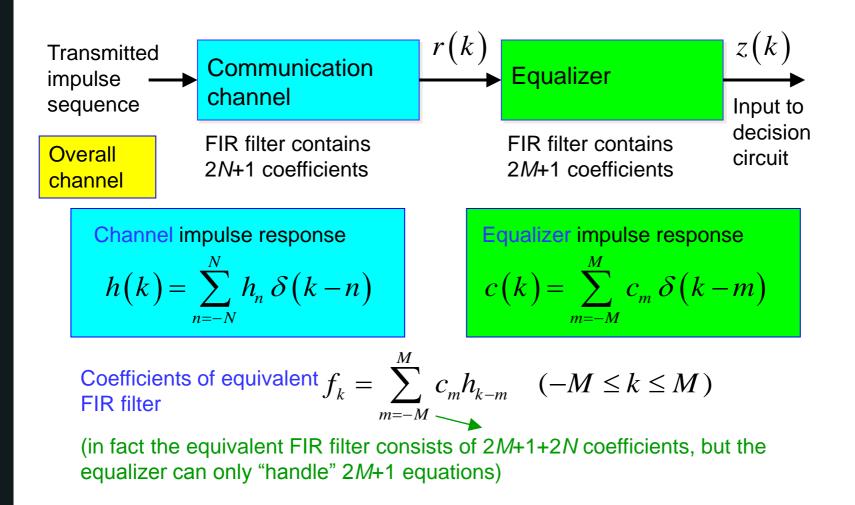
- Zero ISI at the receiver output
- B(f)H(f)E(f)=Z(f)
- Z(f): Nyquist spectrum e.g. raised cosine





## Zero-forcing equalizer







## Zero-forcing equalizer



Overall filter response to be non-zero at decision time k = 0 and zero at all other sampling times  $k \neq 0$ :

$$f_{k} = \sum_{m=-M}^{M} c_{m} h_{k-m} = \begin{cases} 1, \ k = 0\\ 0, \ k \neq 0 \end{cases}$$

This leads to a set of 
$$2M+1$$
 equations:

$$\begin{aligned} h_0 c_{-M} + h_{-1} c_{-M+1} + \dots + h_{-2M} c_M &= 0 \quad (k = -M) \\ h_1 c_{-M} + h_0 c_{-M+1} + \dots + h_{-2M+1} c_M &= 0 \\ &\vdots \\ h_M c_{-M} + h_{M-1} c_{-M+1} + \dots + h_{-M} c_M &= 1 \quad (k = 0) \\ &\vdots \\ h_{2M-1} c_{-M} + h_{2M-2} c_{-M+1} + \dots + h_{-1} c_M &= 0 \\ h_{2M} c_{-M} + h_{2M-1} c_{-M+1} + \dots + h_0 c_M &= 0 \quad (k = M) \end{aligned}$$



Activity



≻Imagine folding a paper in half once

≻Then take the result and fold it in half again; and so on

≻How many times can you do that?



# Least-mean-square (LMS) algorithm <u>Criterion:</u>

- $\succ$  To minimize the mean square error (MSE) between the desired
- equalizer output and the actual equalizer output.  $\xi = E$
- ≻Minimize must be solved iteratively

- $\xi = E[e_k^* \cdot e_k]$
- >Simplest algorithm, requires only 2N + I operations per iteration.
- >The LMS equalizer maximizes the signal to distortion ratio
- at its output within the constraints of the equalizer filter length.
- > A step size  $\alpha$  is used to control the convergence rate and the stability





## Least-mean-square (LMS) algorithm

<u>Disadvantage:</u> Low convergence rate because of the only one parameter  $\alpha$ .

Especially when the eigen values of the input covariance matrix  $R_{NN}$ have a very large spread, i.e.,  $\lambda_{max} / \lambda_{min} > 1$ 

To prevent the adaptation from becoming unstable, the value of a is chosen from  $0 < \alpha < 2 / \sum_{i=1}^{N} \lambda_i$ Where  $\lambda_i$  is the ith eigenvalue of the covariance matrix  $R_{NN}$ . The step size a can be controlled by the total input power in

 $= 1 \text{ for step size a can be controlled by the total model is <math>\frac{N}{N}$ 

order to avoid instability in the equalizer

$$\sum \lambda_i = \boldsymbol{y}_N^T(n) \boldsymbol{y}_N(n)$$





## Least-mean-square (LMS) algorithm

### For convergence towards minimum mean square error (MMSE)

 $\operatorname{Re}\left\{c_{n}\left(i+1\right)\right\} = \operatorname{Re}\left\{c_{n}\left(i\right)\right\} - \Delta \frac{\partial \left|e_{k}\right|^{2}}{\partial \left[\operatorname{Re}\left\{c_{n}\right\}\right]}$ Real part of *n*:th coefficient:

Imagi

inary part of *n*:th coefficient: 
$$\operatorname{Im}\left\{c_{n}\left(i+1\right)\right\} = \operatorname{Im}\left\{c_{n}\left(i\right)\right\} - \Delta \frac{\partial |e_{k}|^{2}}{\partial \left[\operatorname{Im}\left\{c_{n}\right\}\right]^{2}}$$
  
 $|e_{k}|^{2} = e_{k}e_{k}^{*}$  Phase:  $\phi(i+1) = \phi(i) - \Delta_{\phi}\frac{\partial |e_{k}|^{2}}{\partial \phi}$   
2(2M+1)+1  
equations Iteration index Step size of iteration

Equalization/16EC401 Wireless Communication /K.Suriya/AP/ECE/SNSCT

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## Least-mean-square (LMS) algorithm

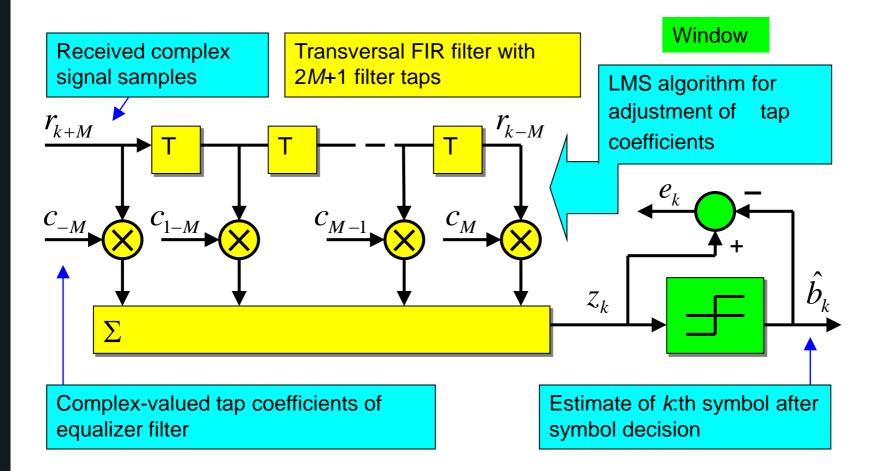
## After some calculation, the recursion equations are obtained in the form

$$\operatorname{Re}\left\{c_{n}\left(i+1\right)\right\} = \operatorname{Re}\left\{c_{n}\left(i\right)\right\} - 2\Delta\operatorname{Re}\left\{\left(e^{j\phi}\sum_{m=-M}^{M}c_{m}r_{k-m}-\hat{b}_{k}\right)r_{k-n}^{*}e^{-j\phi}\right\}$$
$$\operatorname{Im}\left\{c_{n}\left(i+1\right)\right\} = \operatorname{Im}\left\{c_{n}\left(i\right)\right\} - 2\Delta\operatorname{Im}\left\{\left(e^{j\phi}\sum_{m=-M}^{M}c_{m}r_{k-m}-\hat{b}_{k}\right)r_{k-n}^{*}e^{-j\phi}\right\}$$
$$\phi(i+1) = \phi(i) - 2\Delta_{\phi}\operatorname{Im}\left\{\hat{b}_{k}^{*}e^{j\phi}\sum_{m=-M}^{M}c_{m}r_{k-m}\right\}$$



## Conventional linear equalizer of LMS type

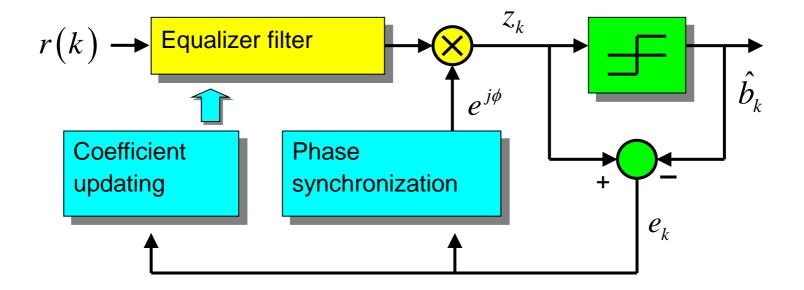






## Joint optimization of coefficients and phase





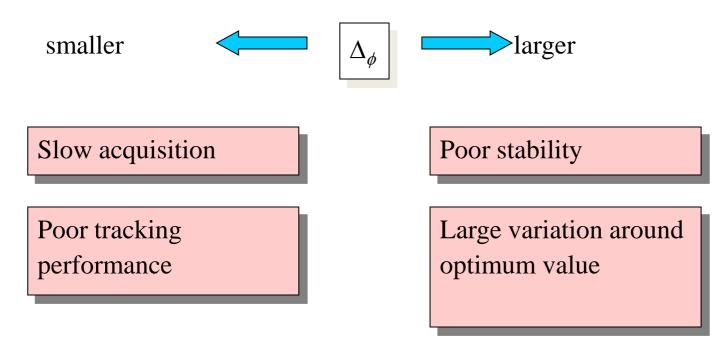
#### Minimize:

$$J = E \left| e_k \right|^2 \qquad e_k = z_k - \hat{b}_k = \left( \sum_{m=-M}^M c_m r_{k-m} \right) \exp(j\phi) - \hat{b}_k$$



## Effect of iteration step size





#### Convergence condition

$$0 < \Delta < 2/\lambda_{max}$$

 $\lambda$  : eigenvalue of autocorrelation matrix of **r** 



## Assessment



- > The decision feedback equalizer has a linear traversal filter which is
  - a) Feed forward section
  - b) Feedback section
  - c) Both of the mentioned
  - d) None of the mentioned



- > Choice of equalizer structure and its algorithm is not dependent on \_\_\_\_\_
  - a) Cost of computing platform
  - b) Power budget
  - c) Radio propagation characteristics
  - d) Statistical distribution of transmitted power





## **THANK YOU**