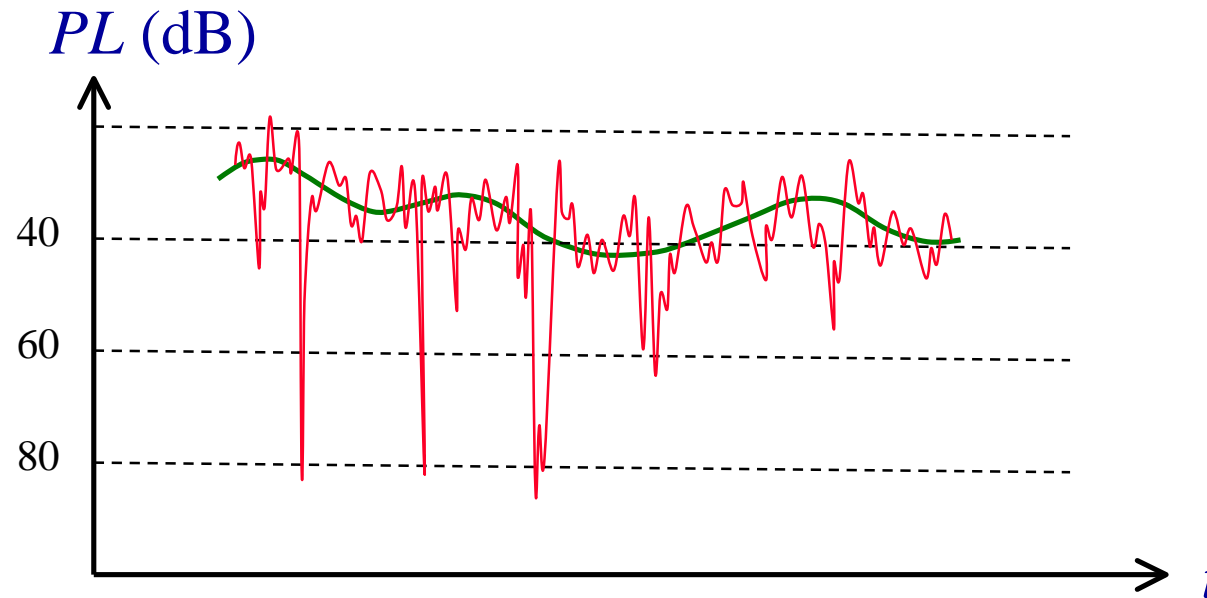


# Mobile Radio Communications

## Session 5: Equalization, coding & diversity



# Non-stationary propagation channel

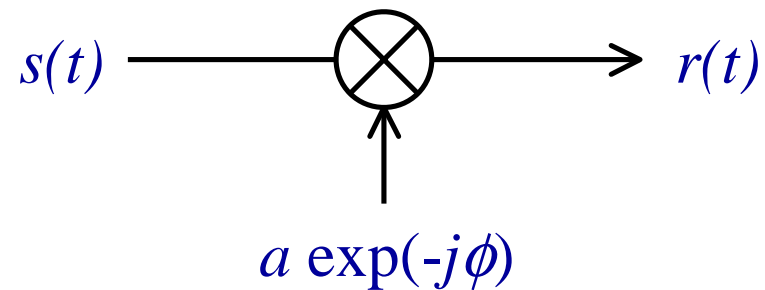


- **slow & fast fading**
- **flat or frequency-selective fading**



# Slow/flat fading channel

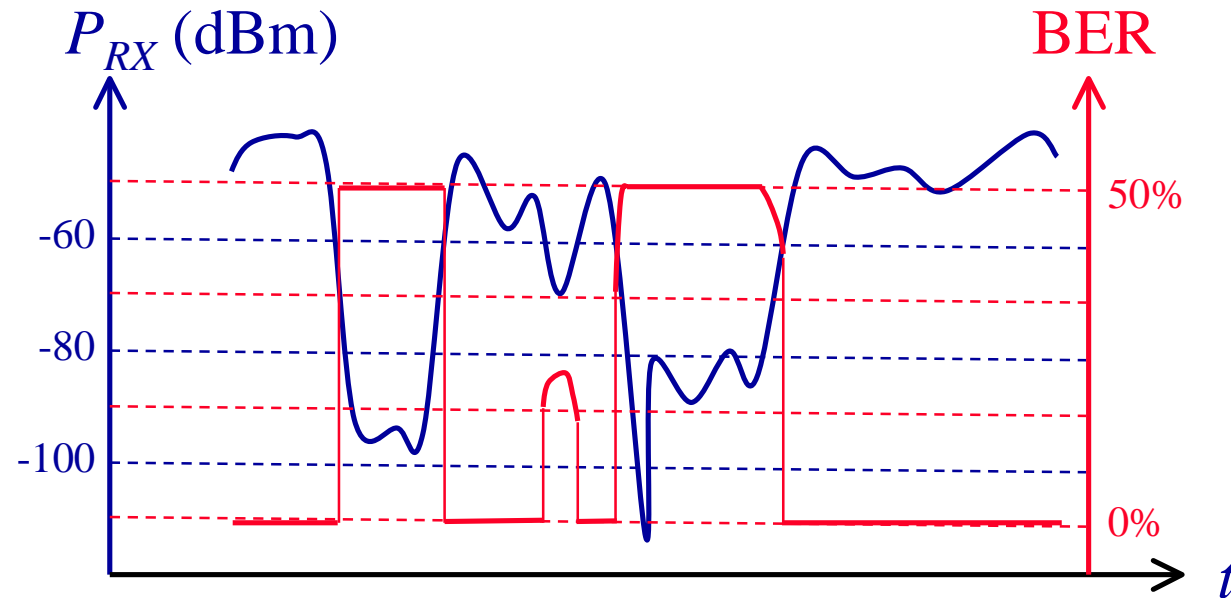
- attenuation/phase shift function of  $t$ , but constant over  $T_s$
- SNR, BER function of  $t$



$$r(t) = a(t) \exp(-j\phi(t)) \cdot s(t) + n(t) \quad 0 \leq t \leq T_s$$



# Non-stationary propagation channel



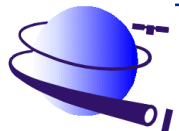
• BER is function of  $E_b/N_0$



# Error probability in slow/flat fading

$$P_e = \int_0^{\infty} P_e(t) dt = \int_0^{\infty} P_e(X) p(X) dX$$

- with  $X = \alpha^2 E_b / N_0$  or SNR
- $\alpha$  is fading gain
- $p(X)$  is probability density of  $X$



# Fading distribution

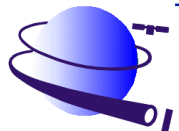
- amplitude  $\alpha$  Rayleigh distributed

$$p(\alpha) = \frac{\pi}{2} \cdot \frac{\alpha}{\bar{\alpha}} \cdot \exp\left(-\frac{\pi}{4} \cdot \frac{\alpha^2}{\bar{\alpha}^2}\right)$$

- power  $X$  exponentially distributed (Chi-square)

$$p(X) = \frac{1}{\Gamma} \cdot \exp\left(-\frac{X}{\Gamma}\right)$$

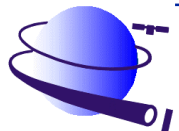
$$\Gamma = \bar{\alpha}^2 E_b / N_0$$



# Error probability in slow/flat fading

$$P_e = \frac{1}{\Gamma} \int_0^{\infty} P_e(X) \cdot \exp\left(-\frac{X}{\Gamma}\right) dX$$

$P_e(X)$  depends on modulation scheme



# Error probability in slow/flat fading

$$\Gamma = \overline{\alpha^2} E_b / N_0$$

$$P_{e,PSK} = \frac{1}{2} \left[ 1 - \sqrt{\frac{1}{1+\Gamma}} \right] \approx \frac{1}{4\Gamma} \quad \text{coherent binary PSK}$$

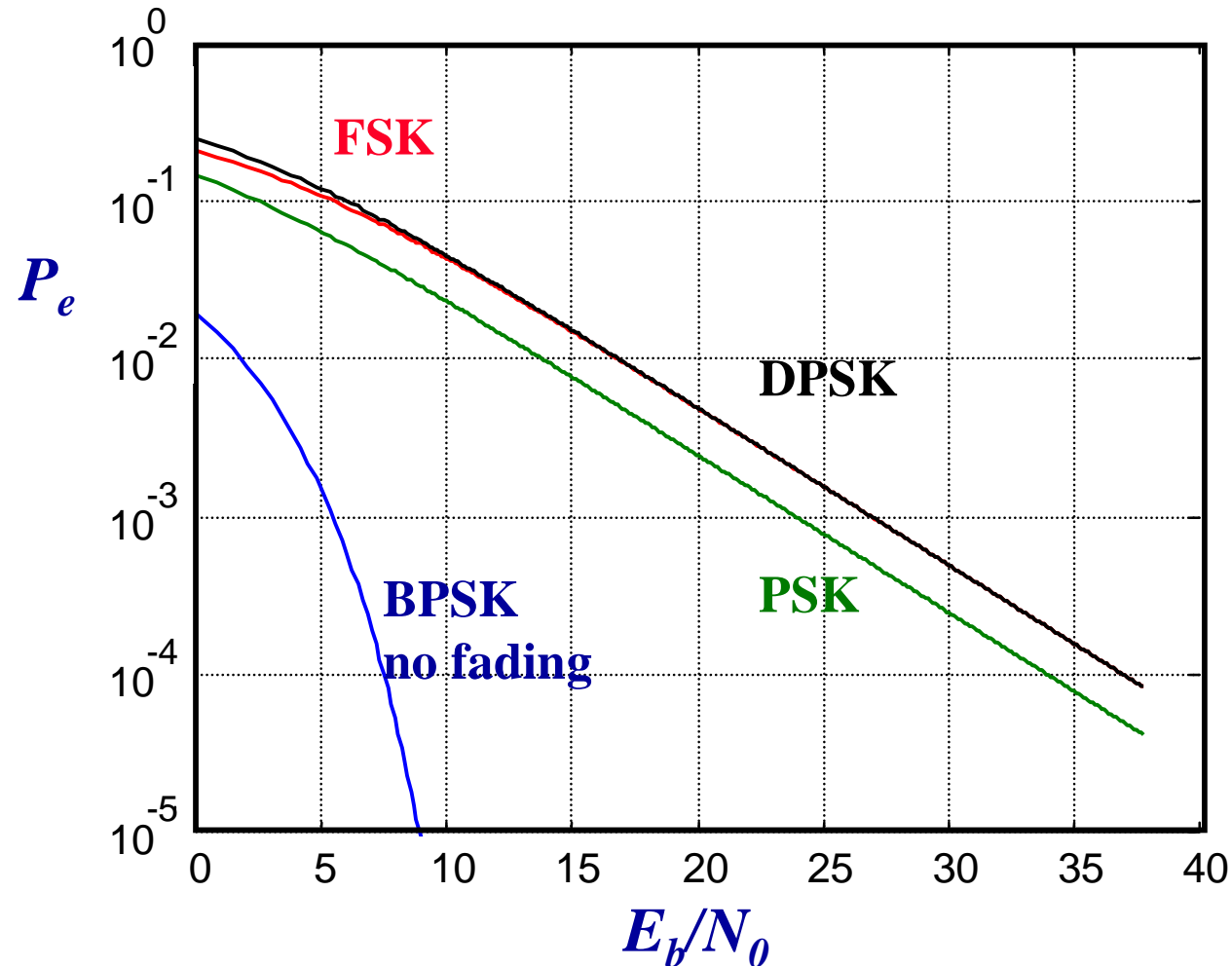
$$P_{e,FSK} = \frac{1}{2} \left[ 1 - \sqrt{\frac{1}{2+\Gamma}} \right] \approx \frac{1}{2\Gamma} \quad \text{coherent FSK}$$

$$P_{e,DPSK} = \frac{1}{2(1+\Gamma)} = \frac{1}{2\Gamma} \quad \text{differential PSK}$$

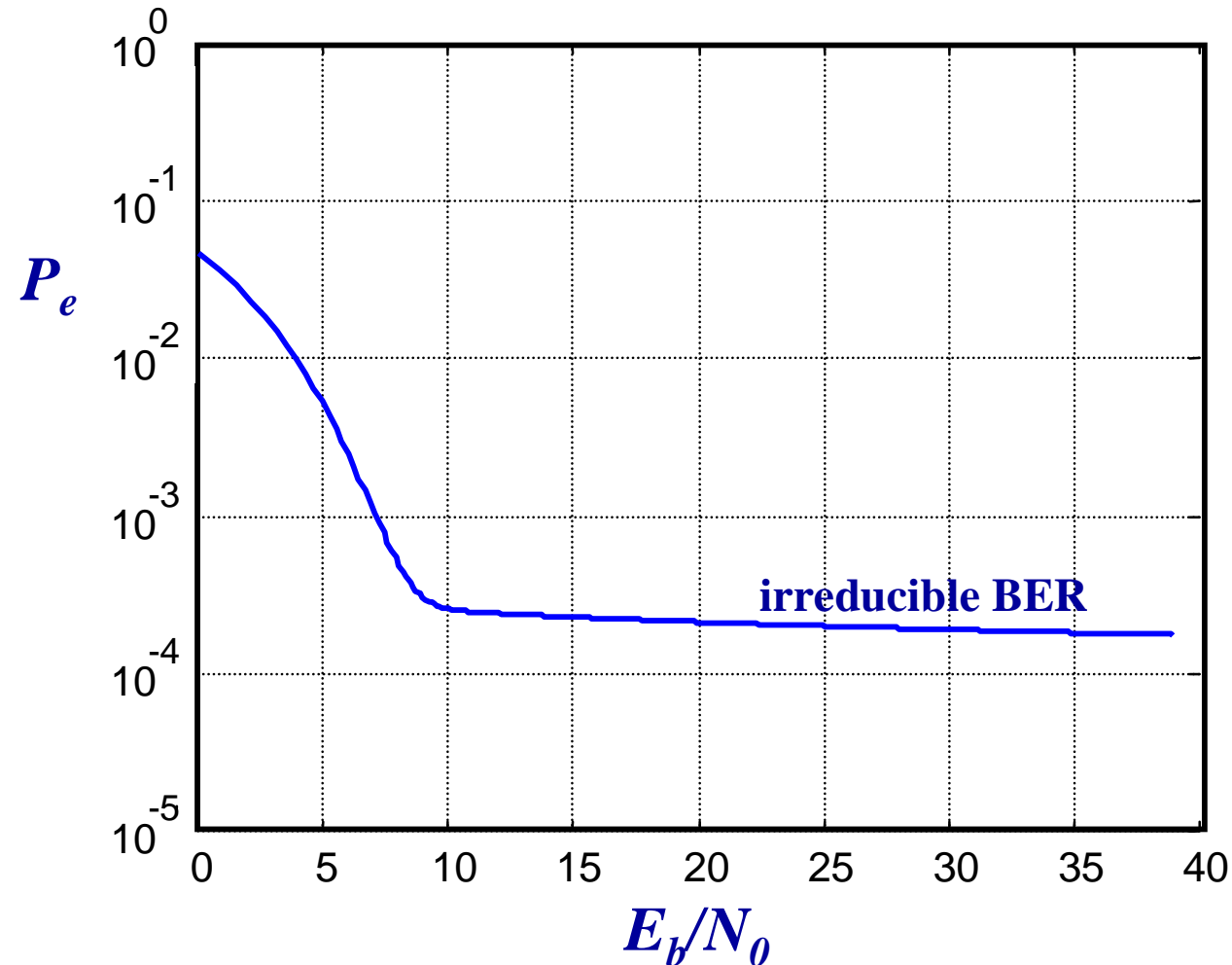




# Performance in slow/flat fading

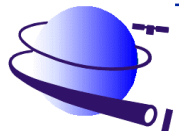


# Performance in freq. sel. fading



# Countermeasures

	flat	frequency selective
slow	<b>DIVERSITY CODING+INTERL.</b>	<b>EQUALIZATION</b>
fast	<b>DIVERSITY CODING+INTERL.</b>	<b>DIVERSITY CODING+INTERL.</b>



# Equalization

$$s(t) \longrightarrow \boxed{h_{ch}(t)} \longrightarrow r(t) = h_{ch}(t) * s(t)$$

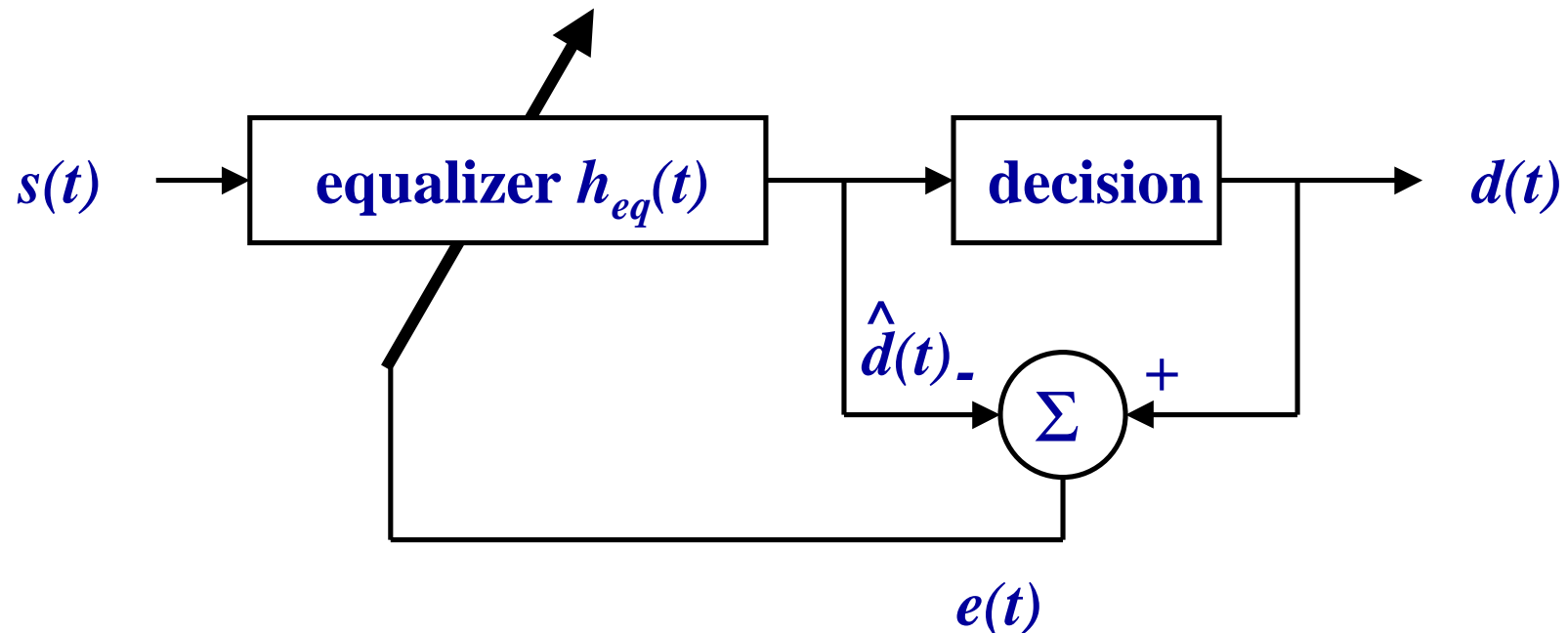
$$s(t) \longrightarrow \boxed{h_{ch}(t)} \longrightarrow r(t) \longrightarrow \boxed{h_{eq}(t)} \longrightarrow x(t) = h_{ch}(t) * h_{eq}(t) * s(t)$$

$$x(t) = s(t) \Rightarrow h_{ch}(t) * h_{eq}(t) = \delta(t)$$

$$H_{eq}(f) = 1/H_{ch}(f)$$



# Adaptive equalization



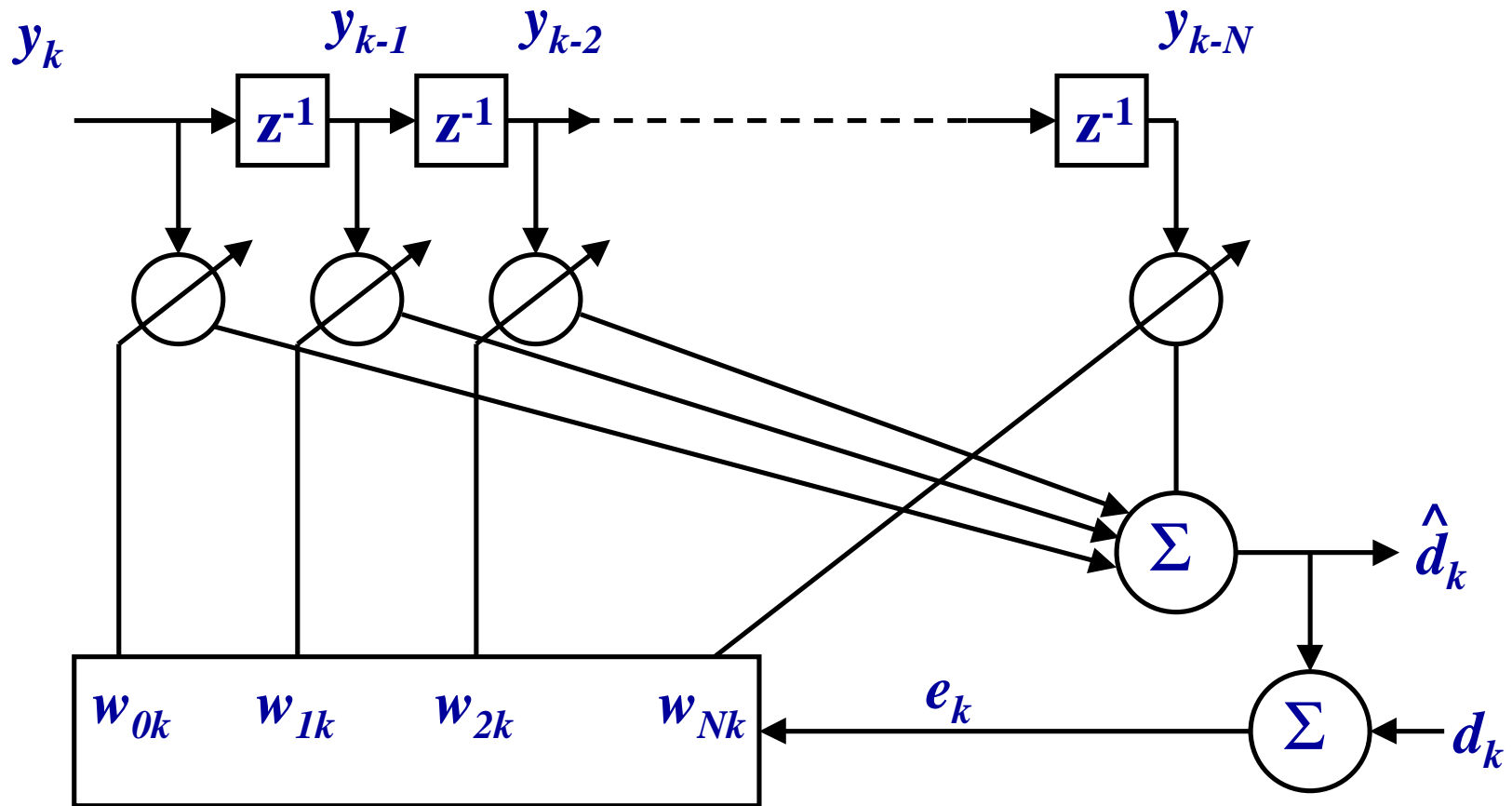
$\hat{d}(t)$  received symbol after equalization

$d(t)$  retrieved symbol

$e(t)$  prediction error



# Generic adaptive equalizer



regular update of  $w_{nk}$



# Adaptive equalization

- training sequence: exploiting known transmit sequence
- blind equalization: exploiting known modulation
- cost function  
mean square error (MSE)



# Adaptive equalization

## LMS algorithm

$$\text{MSE: } E \left[ |e_k|^2 \right] = E \left[ x_k^2 \right] + \vec{w}^T R \vec{w} + 2 \vec{p}^T \vec{w}$$

$x_k$  training sequence symbols

$\vec{w}$  equalizer coefficients

$R$  input correlation/covariance matrix

$\vec{p}$  cross-correlation vector





# Adaptive equalization

$$\vec{p} = E[x_k \vec{y}_k] = E[x_k y_k \quad x_k y_{k-1} \quad \dots \quad x_k y_{k-N}]$$

$$R = E[\vec{y}_k \vec{y}_k^T] = E \begin{bmatrix} y_k^2 & y_k y_{k-1} & \dots & y_k y_{k-N} \\ y_{k-1} y_k & y_{k-1}^2 & \dots & y_{k-1} y_{k-N} \\ \dots & \dots & \dots & \dots \\ y_{k-N} y_k & y_{k-N} y_{k-1} & \dots & y_{k-N}^2 \end{bmatrix}$$

$$\text{MMSE:} \quad \vec{w} = R^{-1} \vec{p}$$

$$E[|e_k|^2]_{\min} = E[x_k^2] - \vec{p}^T R^{-1} \vec{p}$$



# Adaptive equalization

## RLS algorithm

$$\text{MSE: } J(n) = \sum_{i=1}^n \lambda^{n-i} e(i, n) \cdot e^*(i, n)$$

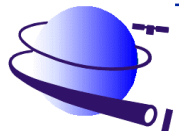
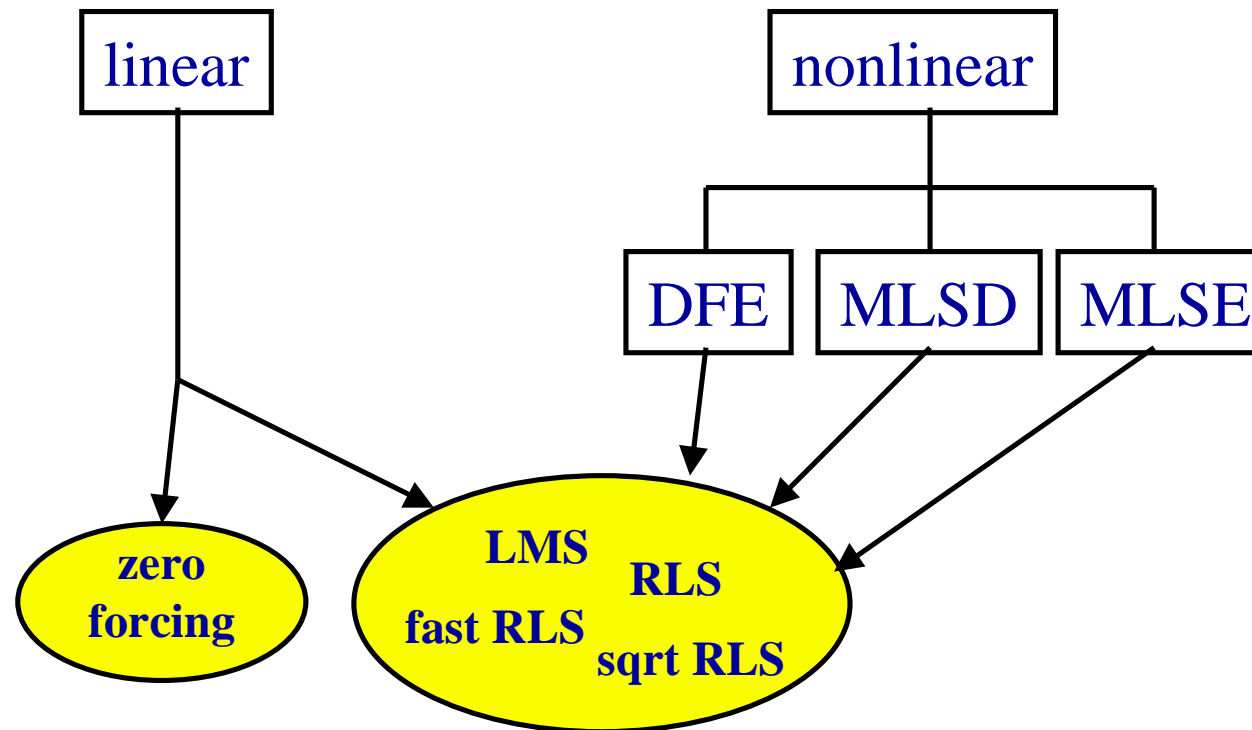
$\lambda$  weighting factor ( $\lambda < 1$ )

$$e(i, n) = x(i) - \vec{y}_N^T(i) \cdot \vec{w}_N(n) \quad 0 \leq i \leq n$$

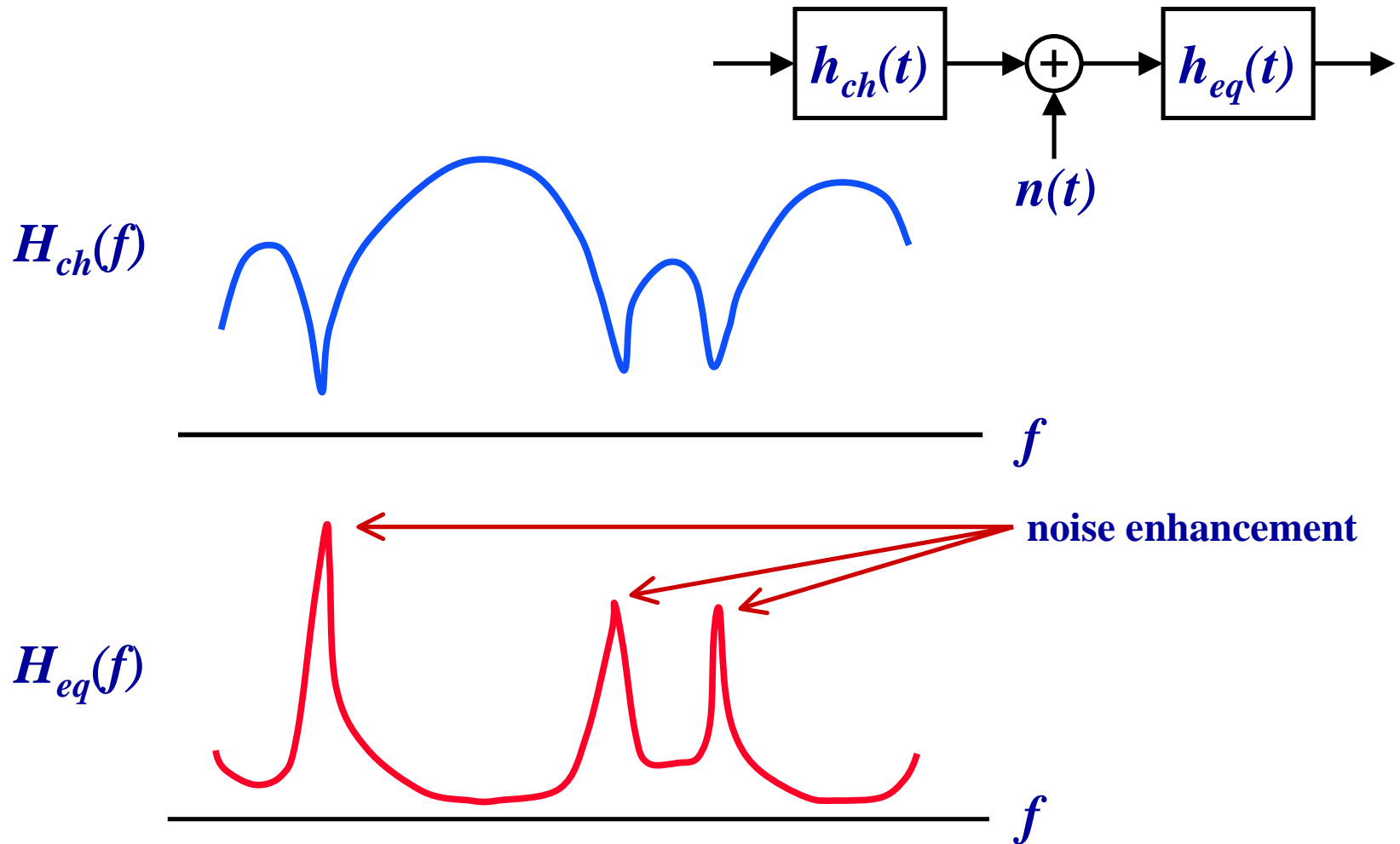
**Exponential forget; fast convergence.**



# Equalizer classification



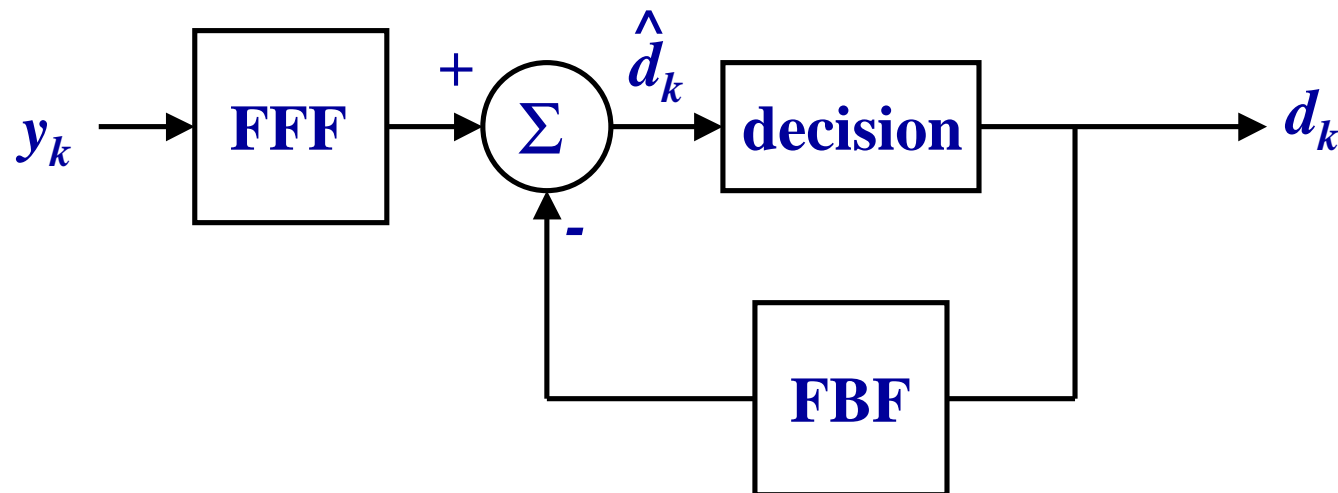
# Problems with linear equalizers



# Nonlinear equalizers: DFE

## Considers symbol by symbols:

- Step 1: decide on symbol
- Step 2: predict ISI
- Step 3: subtract ISI from original signal
- Step 4: goto next symbol



# Nonlinear equalizers: MLSE

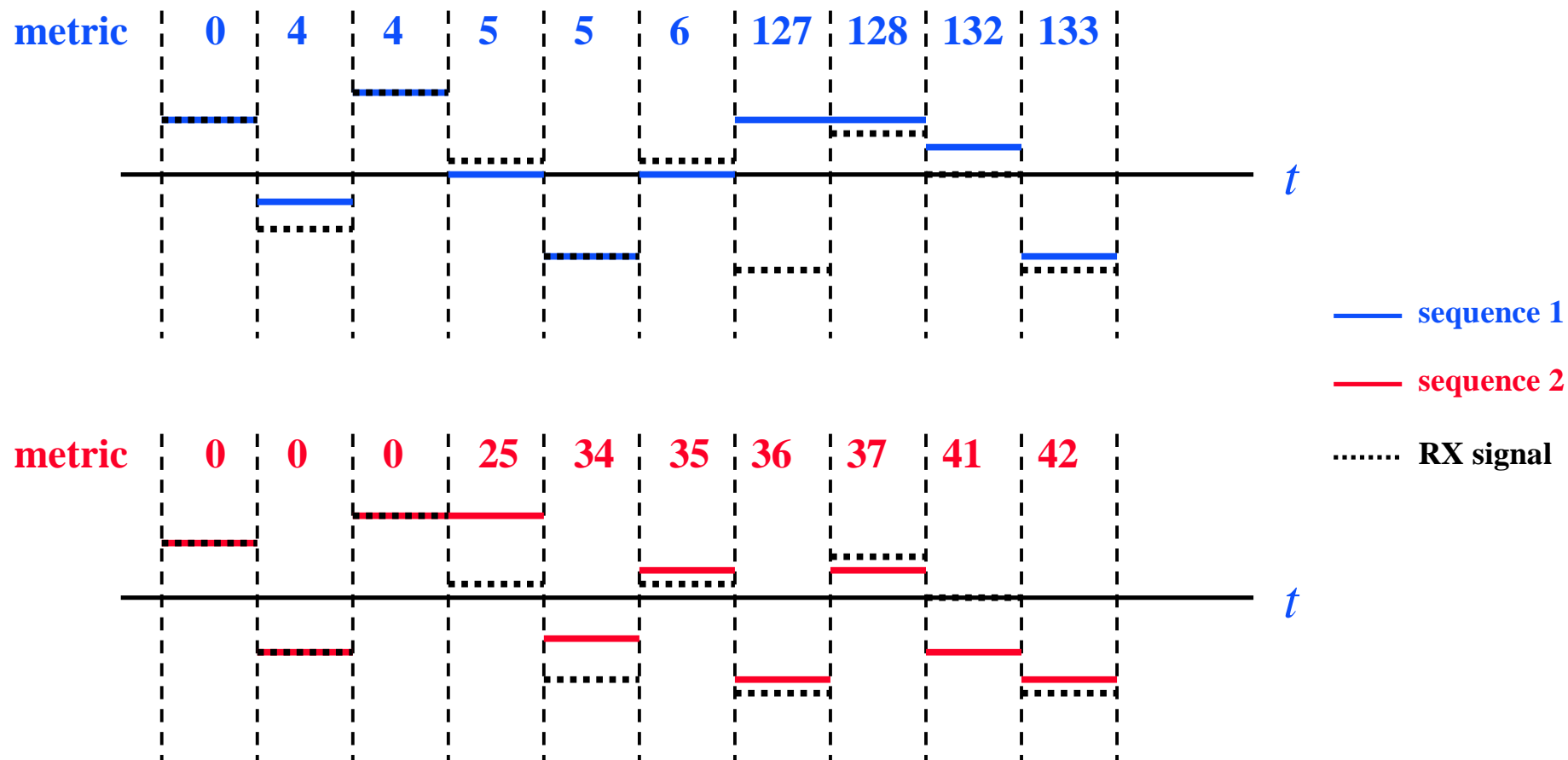
## Considers sequence of symbols:

- Step 1: estimate channel
- Step 2: for all possible symbol combinations, generate receive sequences
- Step 3: compare each generated sequences with actual RX sequence
- Step 4: choose that receive sequence for which accumulated error (metric) is smallest
- Step 5: update channel estimate

## Viterbi algorithm



# MLSE example



# Maximum likelihood estimation

Estimated channel:  $\{h_0, h_1, \dots, h_{L-1}\}$

Received sequence:  $\{r_0, r_1, \dots, r_{L-1}\}$

Choose  $\{s_0, s_1, \dots, s_{L-1}\}$  which minimizes  $\sum_{i=0}^{L-1} C(h_i s_i, r_i)$   
where  $C$  is the metric

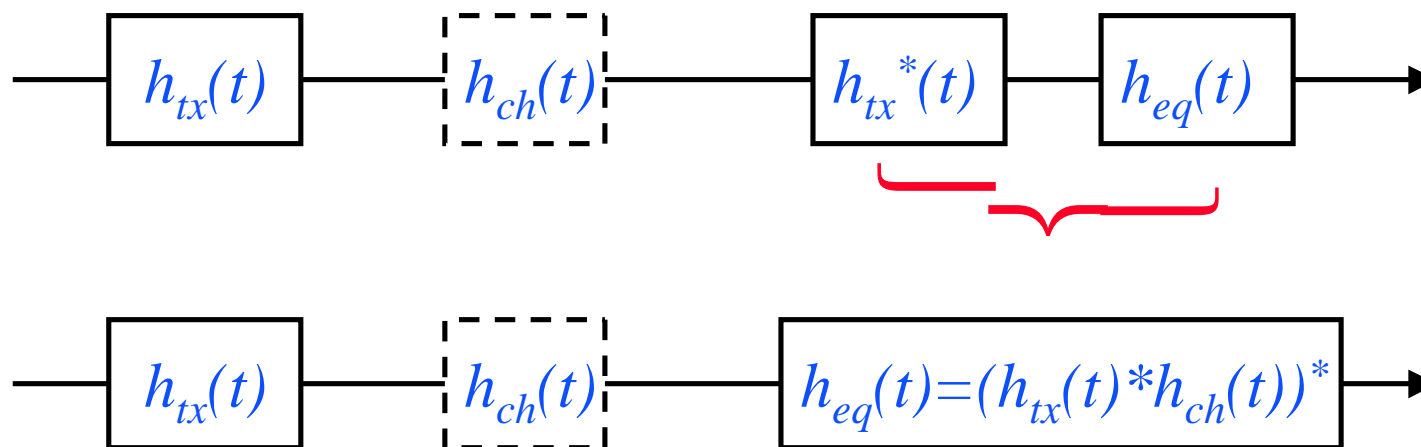
With  $M$  symbols in the alphabet, there are  $M^L$  sequences to choose from.





# Fractionally spaced equalizers

- Sampling higher than symbol rate (Nyquist rate)
- Combination of matched filter and equalizer



# Diversity

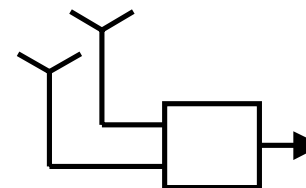
- **Apply multiple paths between TX and RX**
- **Separate paths/branches in**
  - **space**
  - **time**
  - **frequency**
- **Minimize correlation between paths**



# Space diversity

- **Micro-diversity:**

- **antenna diversity**

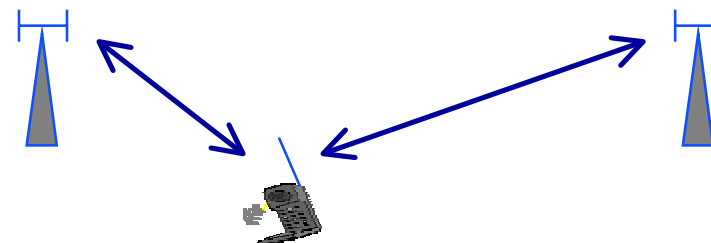


- **polarization diversity**

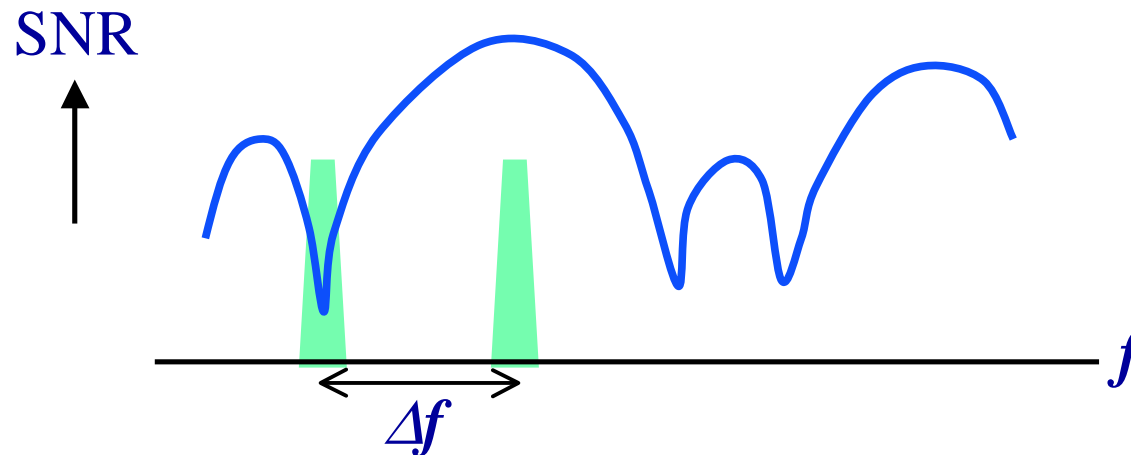


- **Macro-diversity**

- **base station diversity**



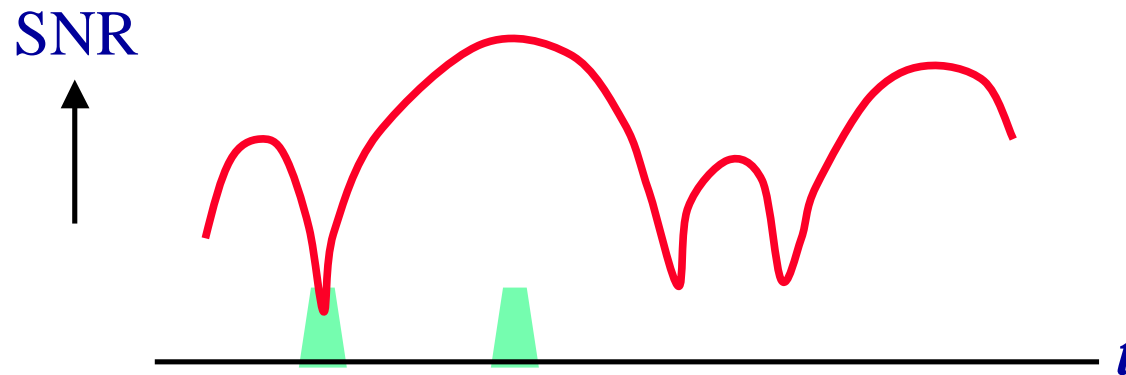
# Frequency diversity



- $\Delta f > B_c$
- **Frequency hopping + retransmission**



# Time diversity



- $\Delta t > T_c$
- **Coding + interleaving**



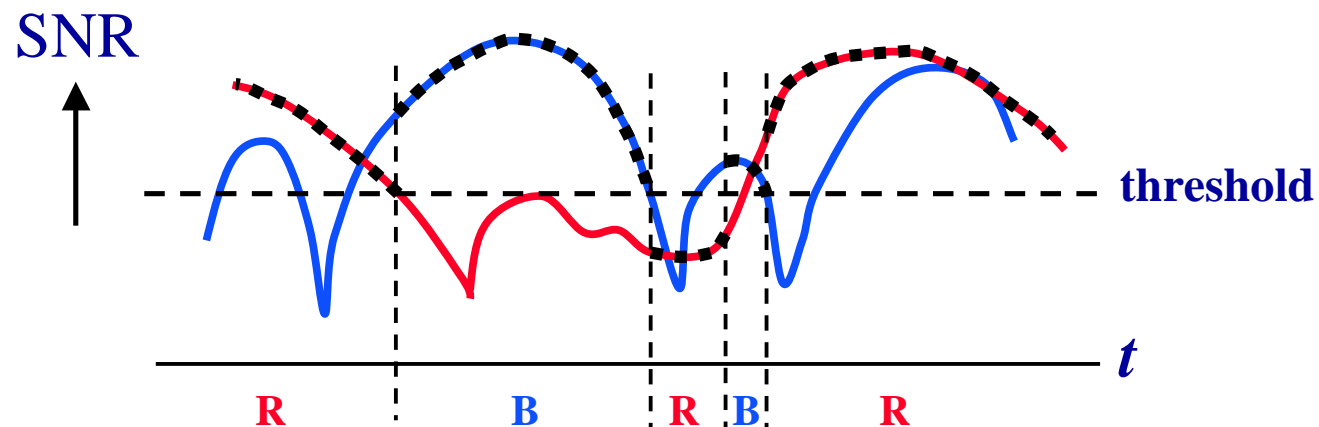
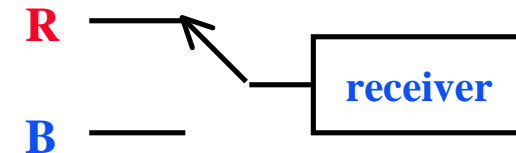
# Combining techniques

- **Switch combining**
- **Selection combining**
- **Maximal ratio combining**
- **Equal gain combining**



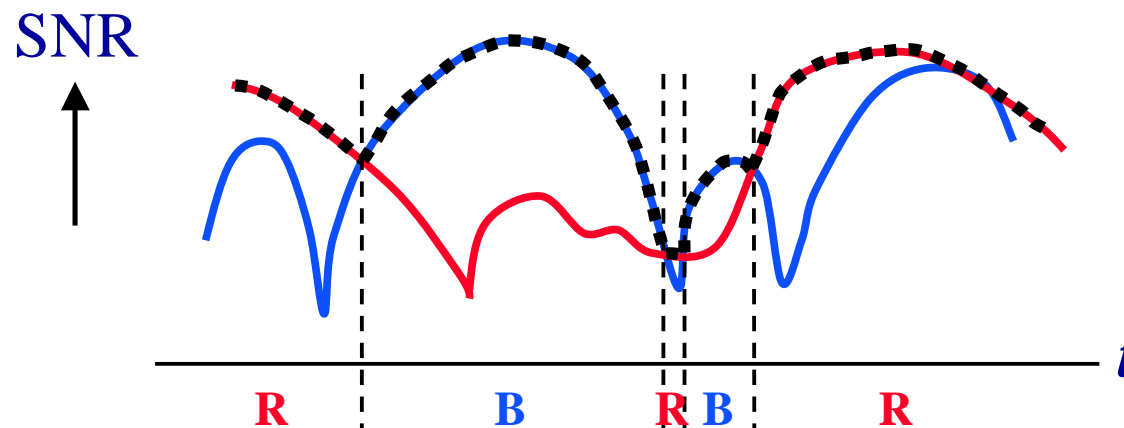
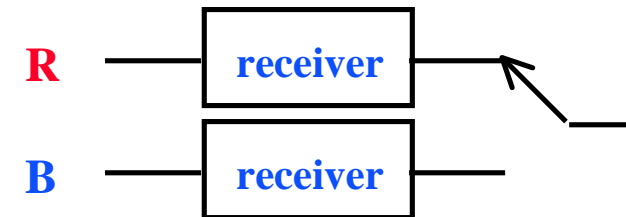
# Switch diversity

- Remain on one branch until SNR drops below a threshold
- Branches **R** and **B**.



# Selection diversity

- Always take the best branch
- Branches **R** and **B**.





# Selection diversity

**Improvement derivation:**

$$SNR = \gamma \qquad \bar{\gamma} = \Gamma = \frac{E_b}{N_0} \alpha^2$$

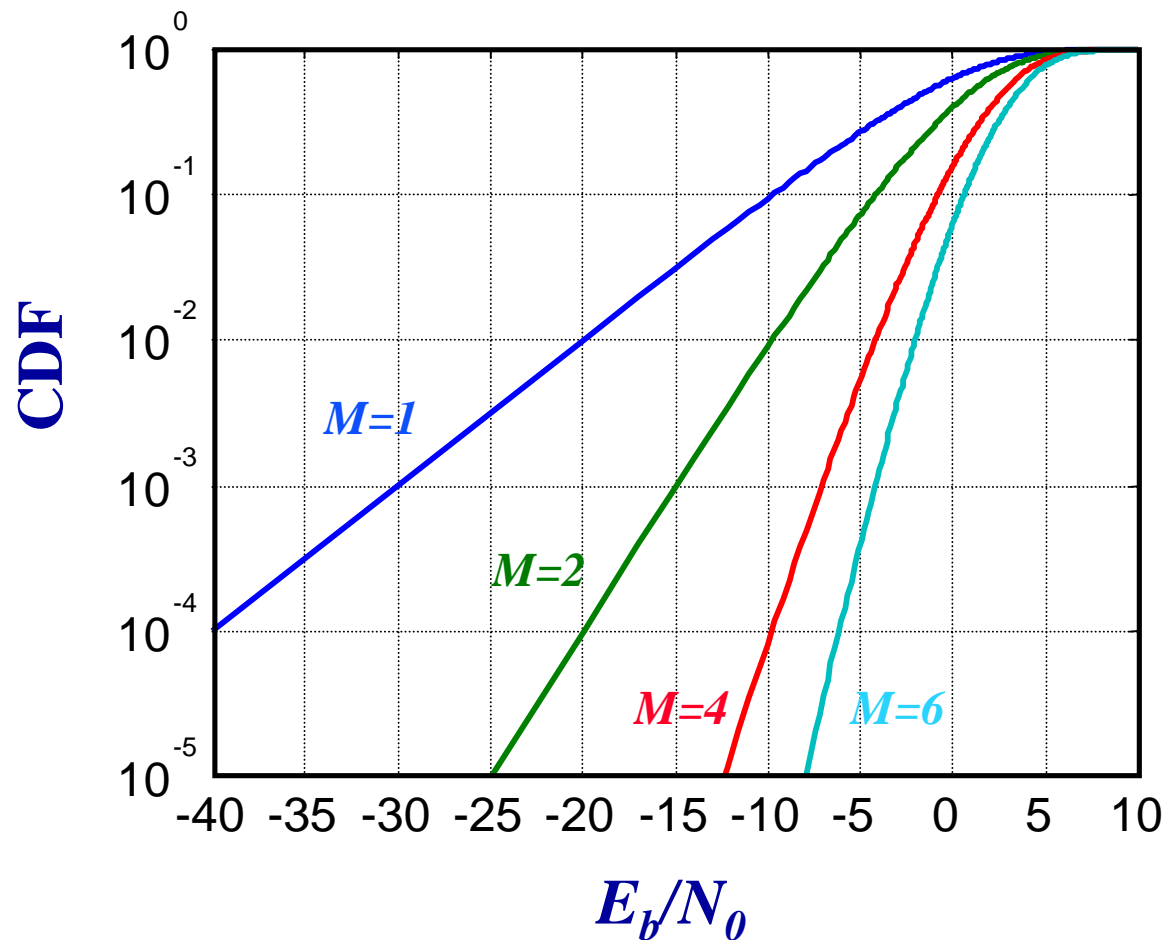
$$p(\gamma) = \frac{1}{\Gamma} e^{-\gamma/\Gamma}$$

**Single branche:**  $P_r(\gamma \leq t) = \int_0^t \frac{1}{\Gamma} e^{-\gamma/\Gamma} d\gamma = 1 - e^{-t/\Gamma}$  **outage**

**M branches:**  $P_r(\gamma_1, \gamma_2, \dots, \gamma_M \leq t) = \left(1 - e^{-t/\Gamma}\right)^M$



# Selection diversity



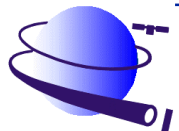
# Maximum ratio combining

- Co-phase accumulation of branches
- Individually weighted for optimal SNR

signal  $r_M = \sum_{i=1}^M G_i r_i$

noise  $N_T = \sum_{i=1}^M G_i^2 N_i^2$

Optimize SNR  $\gamma_M = \frac{r_M^2}{2N_T} \Rightarrow G_i = \frac{r_i}{N_i}$



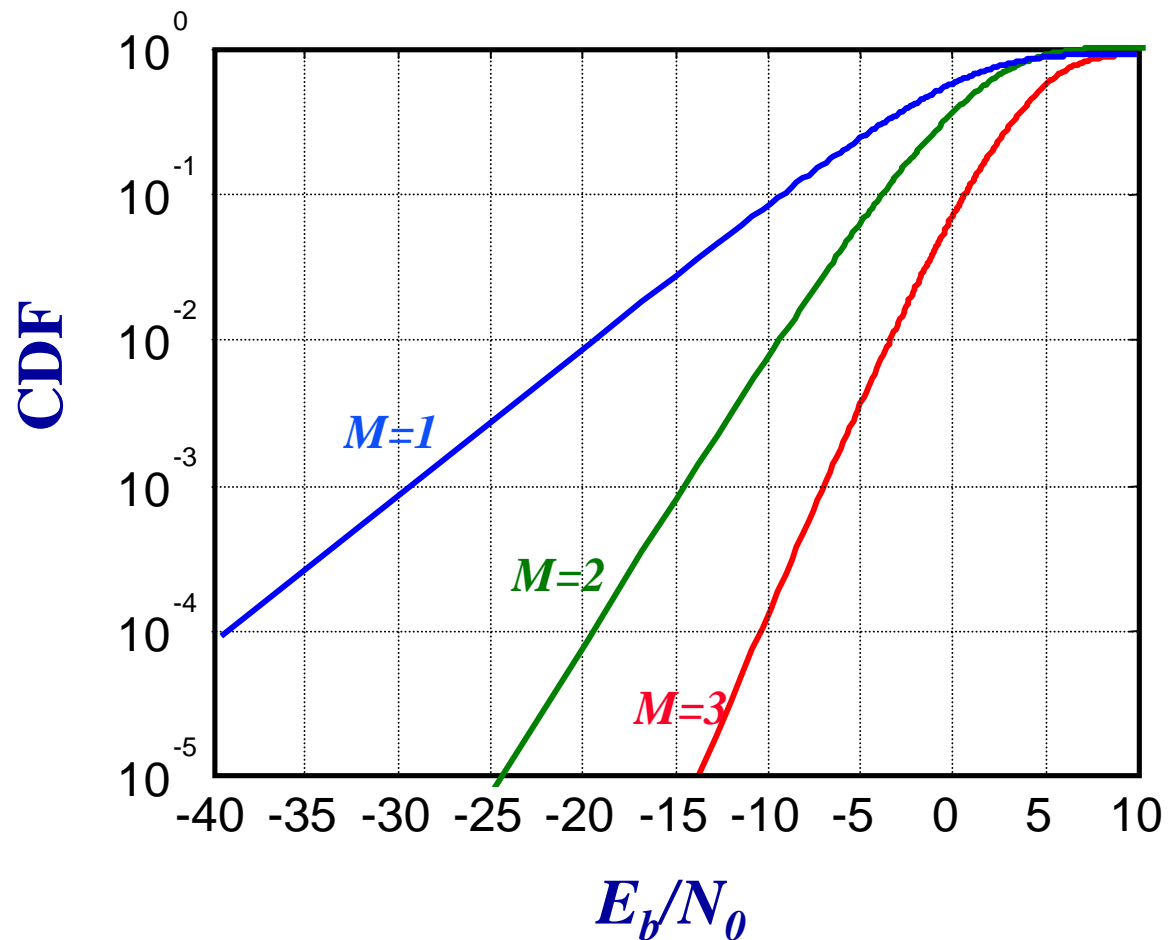
# Maximum ratio combining

**Total SNR**      $\gamma_M = \sum_{i=1}^M \gamma_i$      **sum of individual SNRs**

**Outage**      $\Pr(\gamma_M \leq t) = 1 - e^{-t/\Gamma} \sum_{i=1}^M \frac{(t/\Gamma)^{i-1}}{(i-1)!}$



# Maximal ratio combining



# Equal gain combining

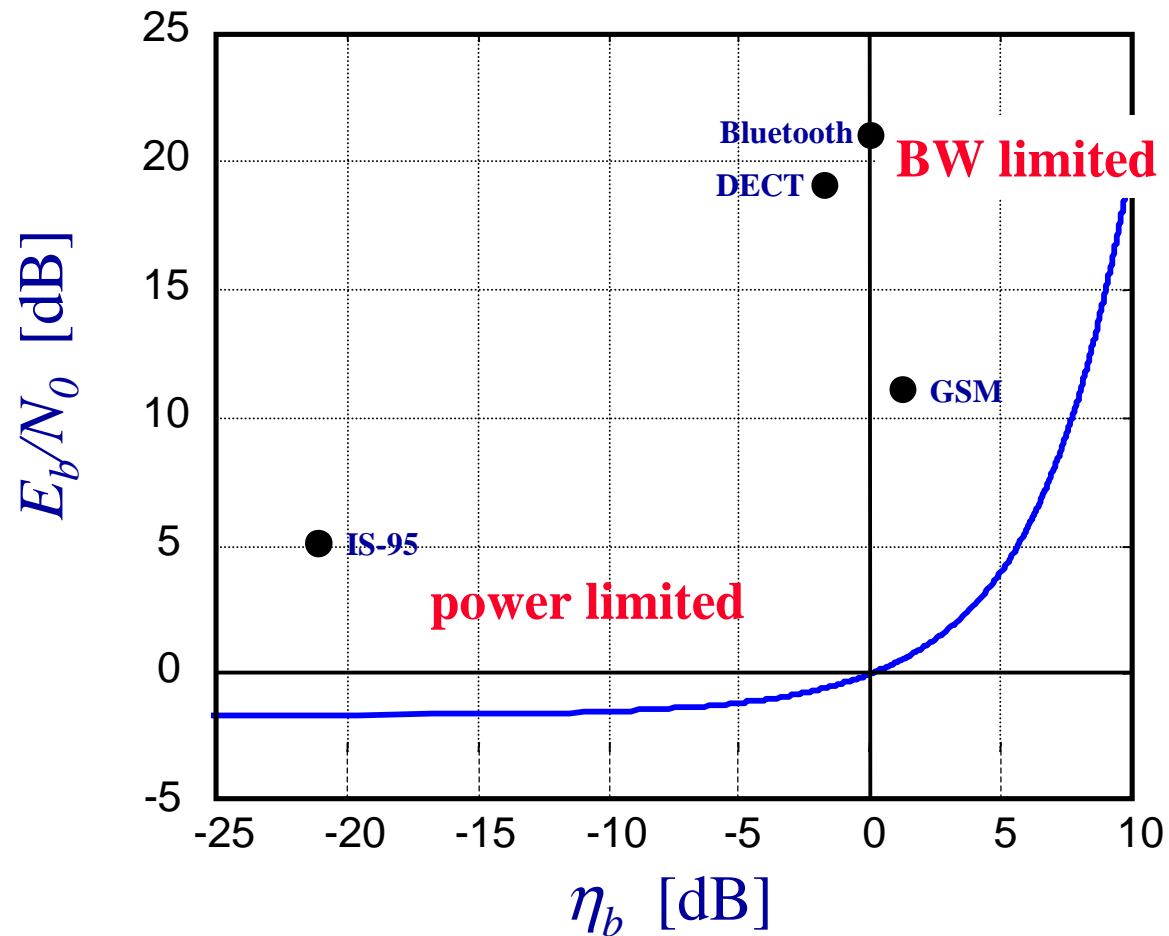
- Co-phase accumulation of branches
- Equally weighted with unity gain
- Performance between selection and MRC

signal

$$|r_M| = \sum_{i=1}^M |r_i|$$



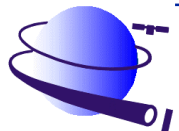
# Power-bandwidth trade-off



# Channel coding

- Add controlled redundancy
- Create dependencies between bits
- Correlation between correct and incorrect bits
- The more bits involved, the stronger the code

**HELPS ONLY IF CHANNEL CONDITIONS VARY:  
“good” bits help “bad” bits**





# Channel coding

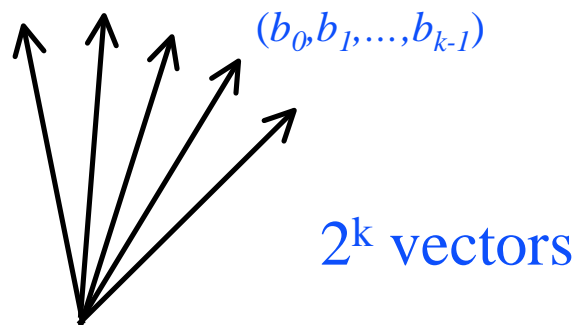
- **Make dependencies**
- **Example: (7,4) code**
  
- **4 user bits  $\rightarrow$  7 coded bits**
- **Distance 1  $\rightarrow$  3**

0000 000  
0001 011  
0010 110  
0011 101  
0100 111  
0101 100  
0110 001  
0111 010  
1000 101  
1001 110  
1010 011  
1011 000  
1100 010  
1101 001  
1110 100  
1111 111

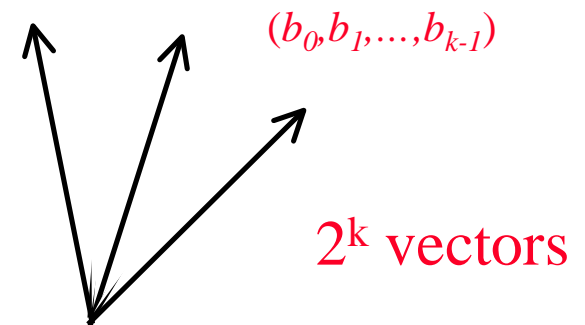


# Code space

**k-dimensional space**



**n-dimensional space**



distance increases

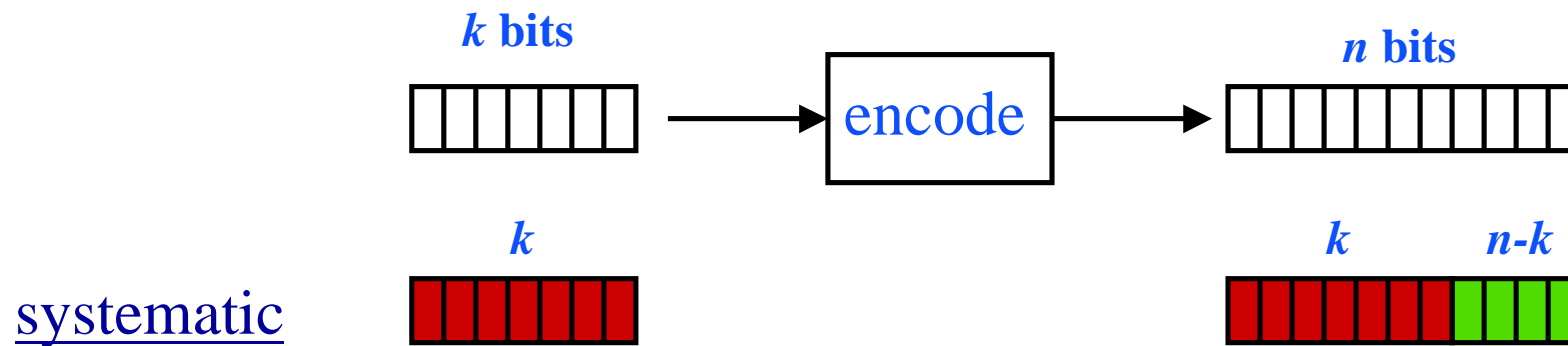


# Coding characteristics

$k$  user bits,  $n$  coded bits

$n-k$  “parity” bits

coding rate  $\frac{k}{n}$



# Coding characteristics

linear

If  $c_i$  and  $c_j$  code words, then  $c_i \oplus c_j$  is code word as well.

All-zero code word

cyclic

If  $c$  is a code word, then all cyclic shifts all code words as well.

$c_0, c_1, c_2, c_3$    $c_1, c_2, c_3, c_0$   
 $c_2, c_3, c_0, c_1$   
 $c_3, c_0, c_1, c_2$



# Coding characteristics

Weight

$$w(c_i) = \sum_{l=0}^{n-1} c_{i,l}$$

Hamming distance

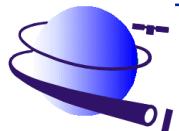
$$d(c_i, c_j) = \sum_{l=0}^{n-1} (c_{i,l} \oplus c_{j,l})$$

Minimum distance

$$d_{\min} = \text{MIN} [d(c_i, c_j)]$$

Perfect code

$$d(c_i, c_j) = d_{\min} \quad \forall i, j$$



# Example: (7,4) BCH code

0000 000  $c_0$

0001 011  $c_1$

0010 110

0011 101

0100 111  $c_4$

0101 100

0110 001

0111 010

1000 101

1001 110

1010 011

1011 000

1100 010

1101 001

1110 100

1111 111  $c_{15}$

– Systematic: 4 user bits, 3 parity bits

– Linear: e.g.  $c_1+c_4=c_5$

– Non cyclic

–  $w(c_1)=3$

–  $w(c_{15})=7$

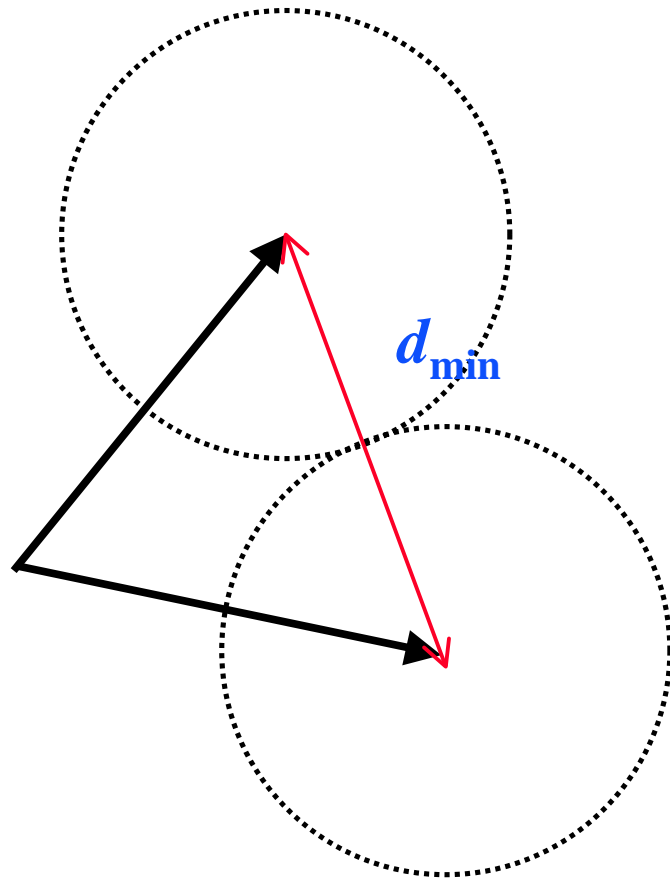
–  $d(c_1,c_4)=3$

–  $d(c_0,c_{15})=7$

–  $d_{min}=3$



# Error detection and correction



Detects up to  $l = d_{\min} - 1$  errors

Corrects up to  $t = \text{int} \left[ \frac{d_{\min} - 1}{2} \right]$  errors,

but then detects only  $l = \text{int} \left[ \frac{d_{\min}}{2} \right]$  errors!

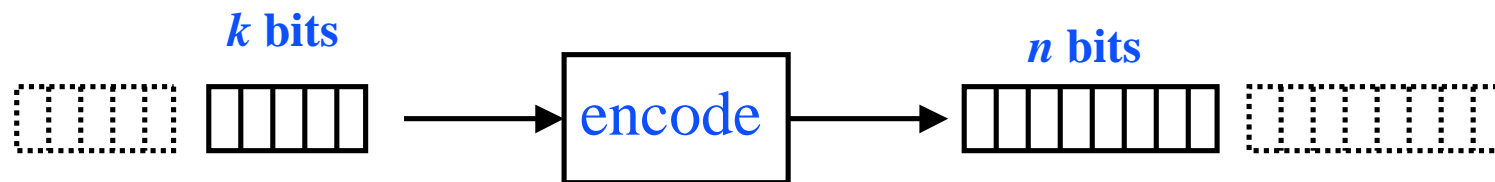
**Example: (7,4) BCH code**

$$d_{\min}=3 \Rightarrow t=1, l=1, \text{ or } t=0, l=3$$



# Block codes

- User bit stream is divided into blocks of  $k$  bits
- Expand every  $k$ -bit block to a  $n$ -bit code word





# Block codes

## Hamming code

$$(n, k) = (2^m - 1, 2^m - 1 - m)$$

$$n - k = m$$

## Hadamard code

$$A_0 = \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix} \quad A_k = \begin{bmatrix} A_{k-1} & A_{k-1} \\ A_{k-1} & -A_{k-1} \end{bmatrix}$$

$$d_{\min} = N/2$$

## Golay code

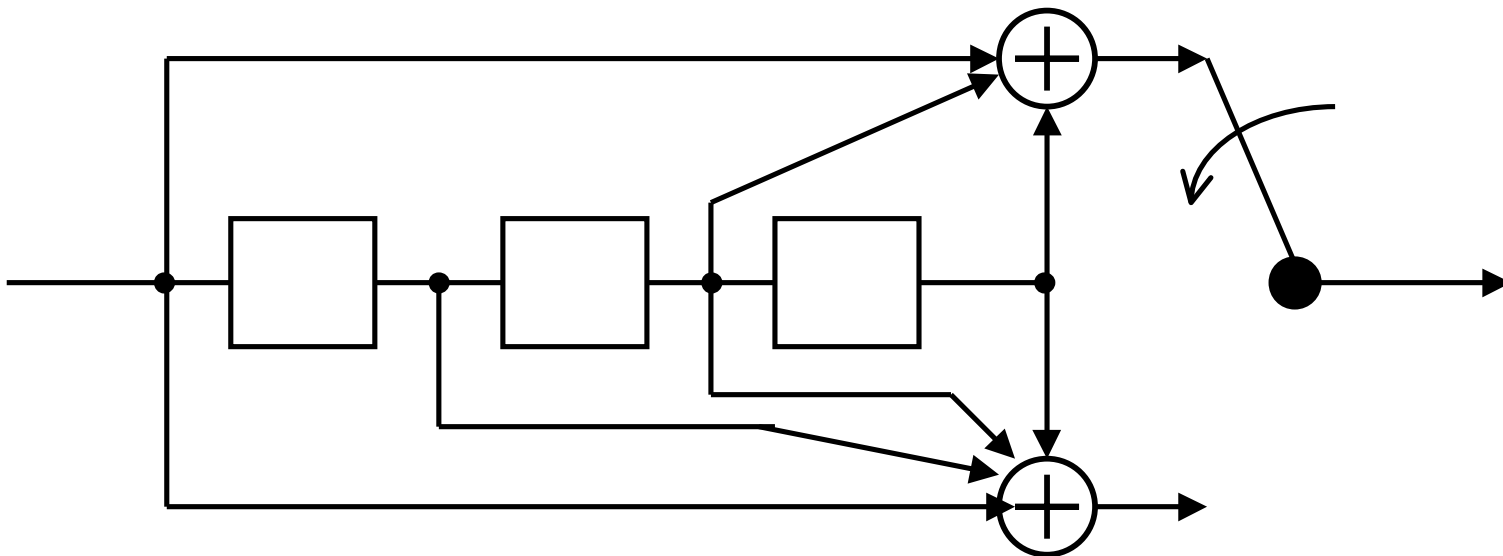
perfect (23, 12) code

$$d_{\min} = 7, t = 3$$

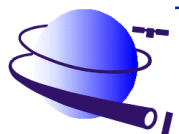
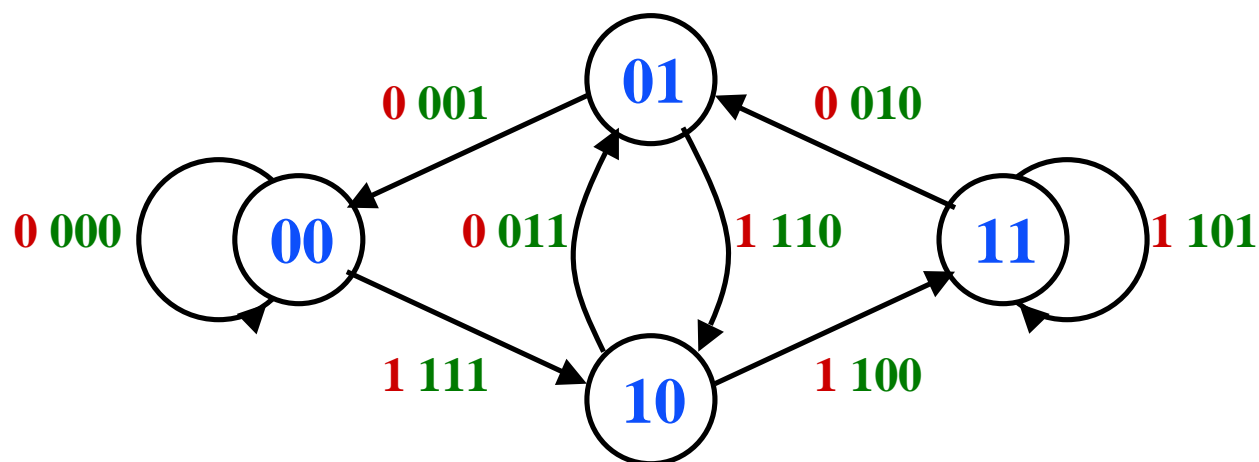
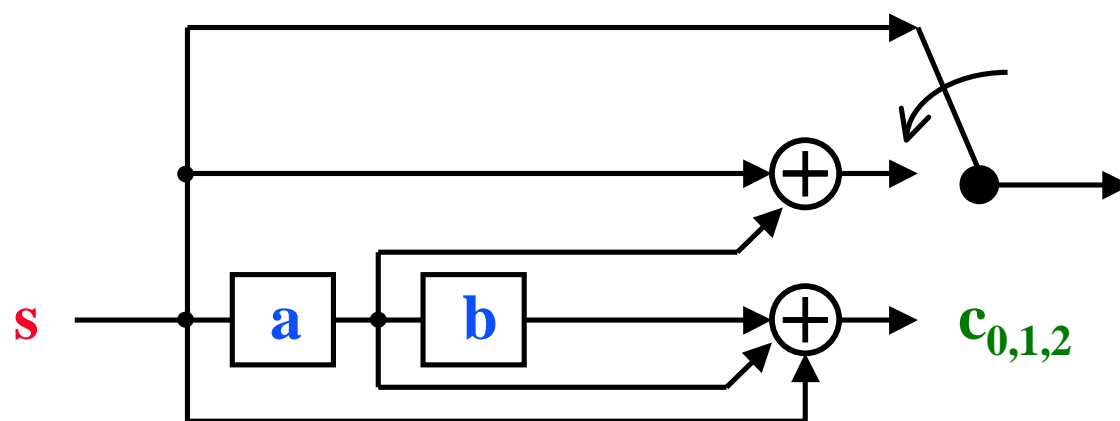


# Convolutional codes

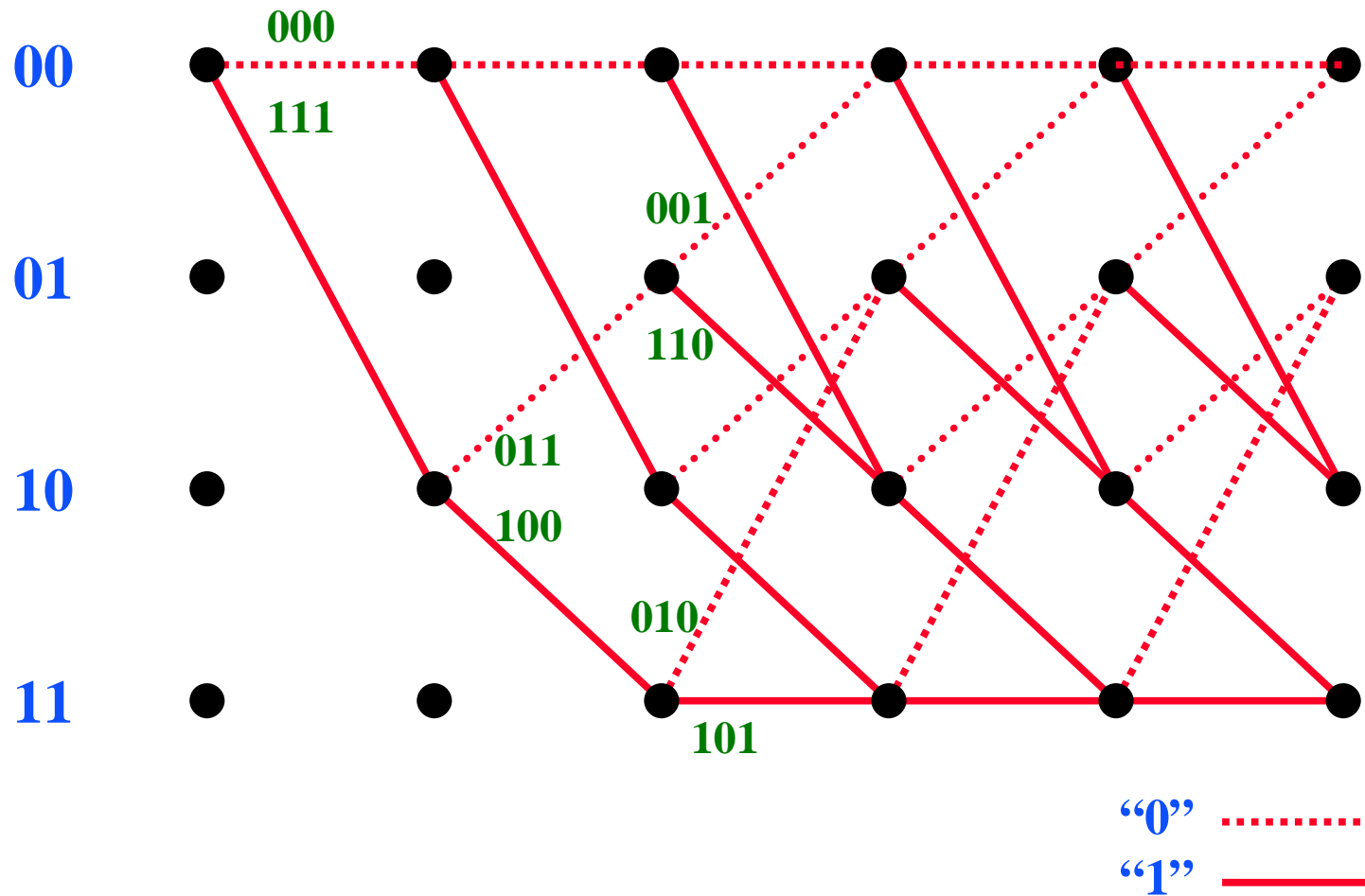
- sliding bit streaming process
- $(n,k,m)$  code with  $m$  memory elements
- constraint length  $m+1$



# Example convolutional coder

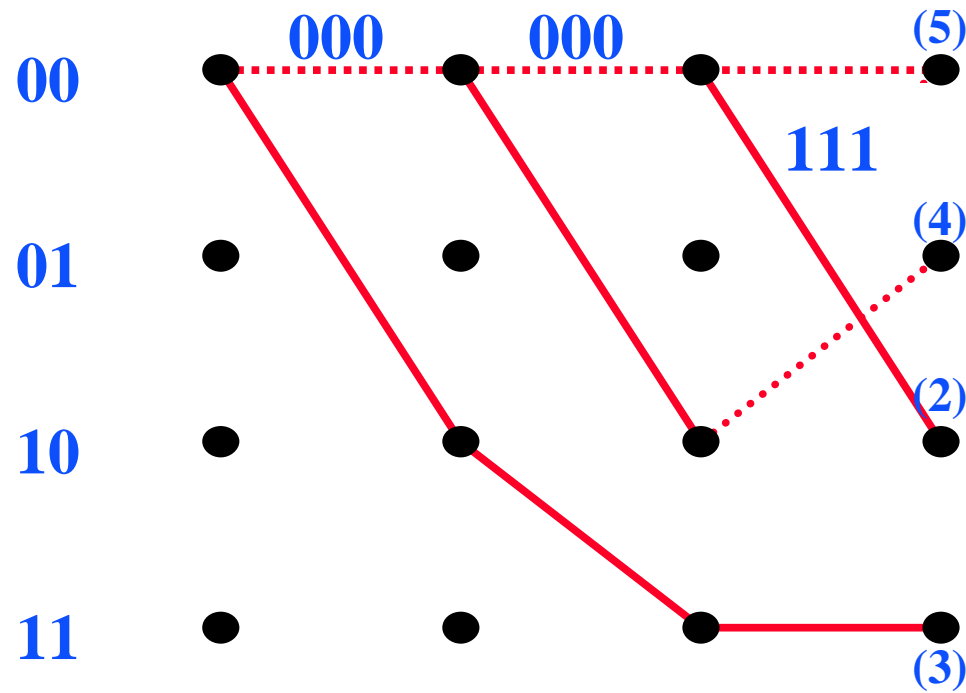


# Trellis decoder



# Viterbi decoder

- Compare input with possible output sequences metric
- Keep path with minimum accumulated metric



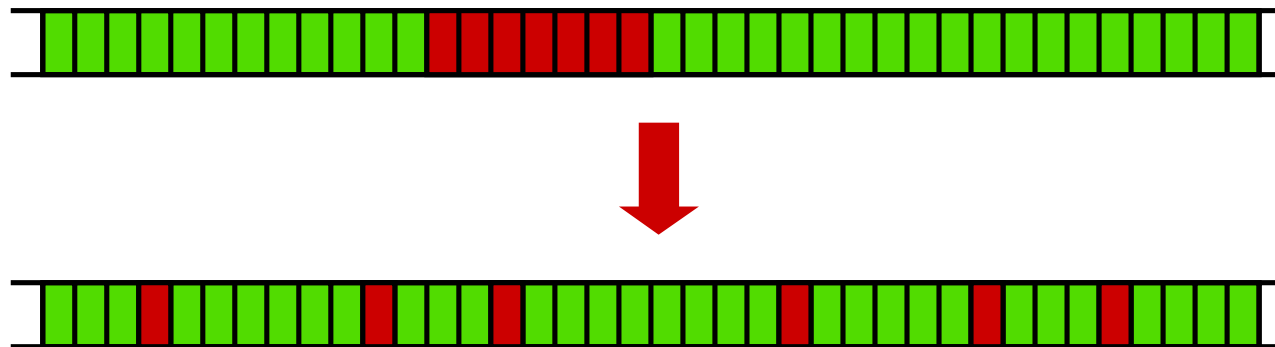
**Received: 001 100 111**



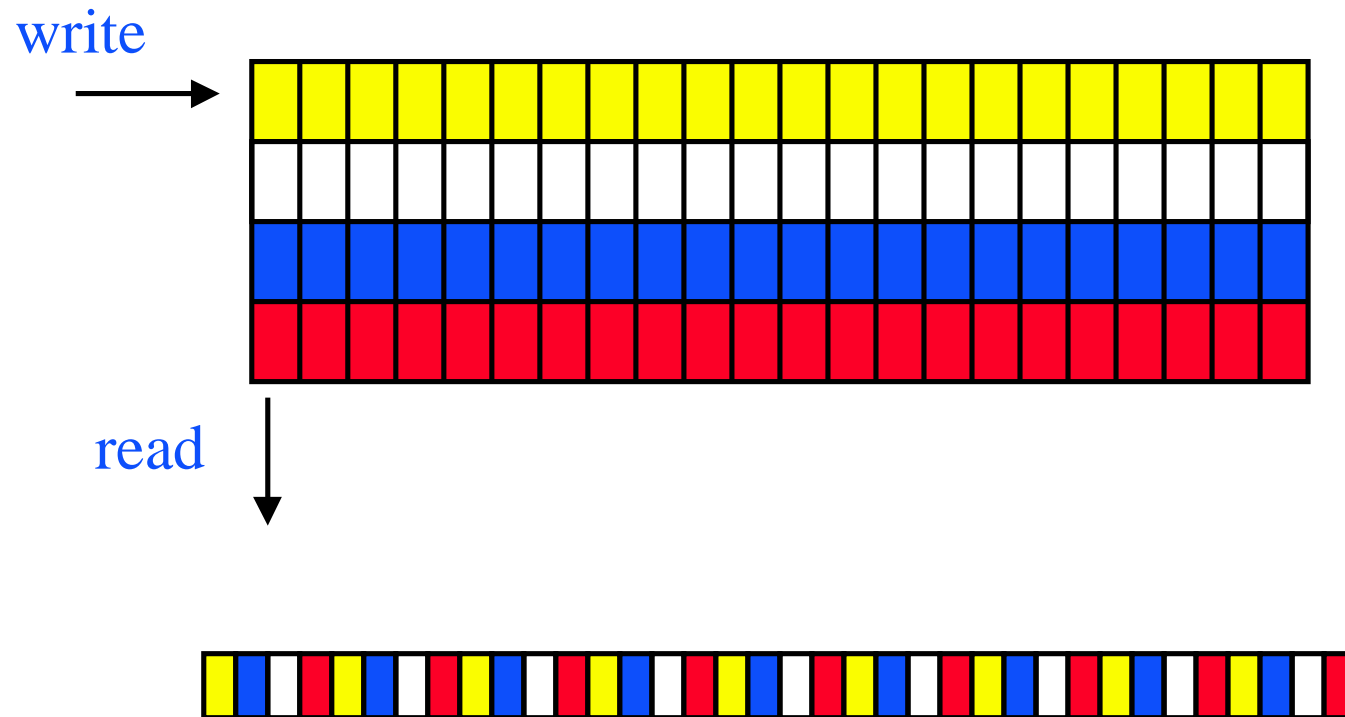
# Interleaving

Coding: “good” bits help to correct “bad” bits  $\Rightarrow$   
bursts of errors difficult to correct

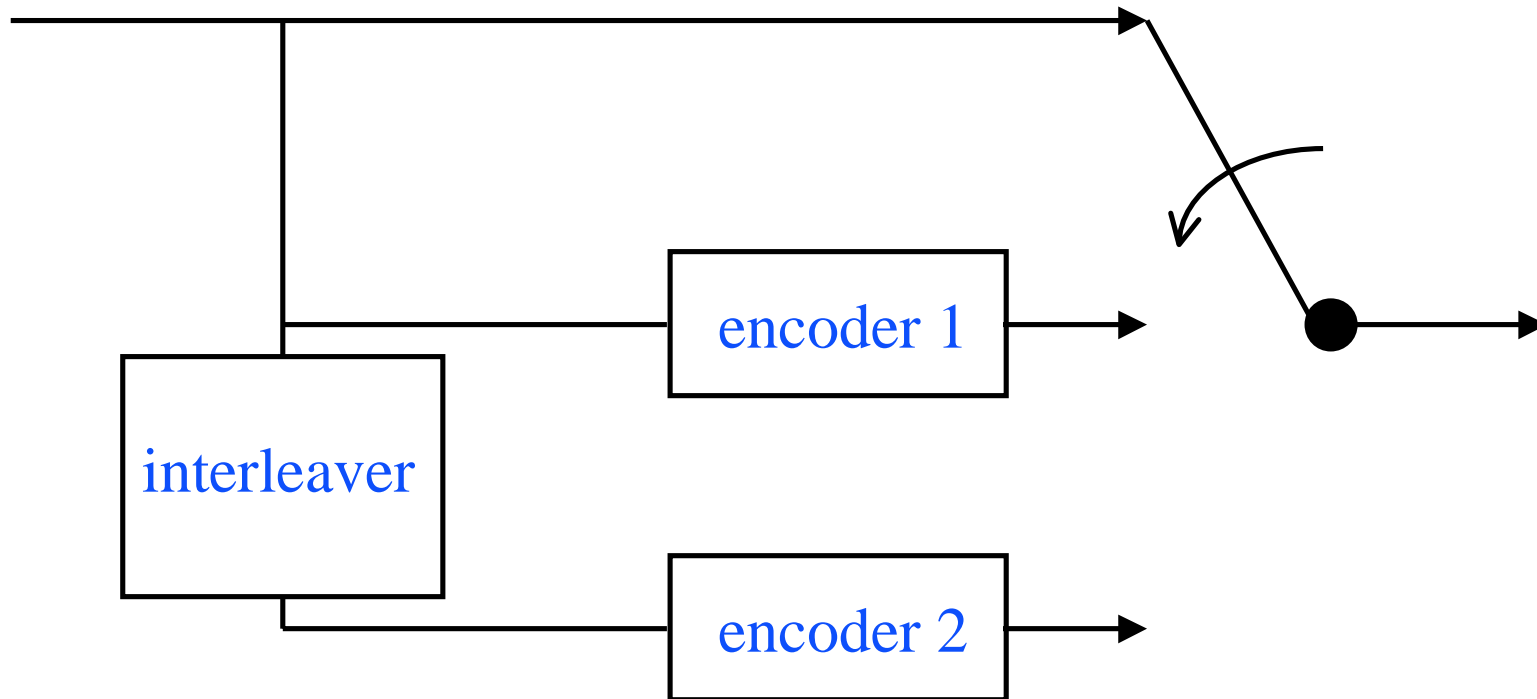
Interleaving: spread “bad” bits so they are surrounded by  
“good” bits



# Block interleaving



# Turbo coding



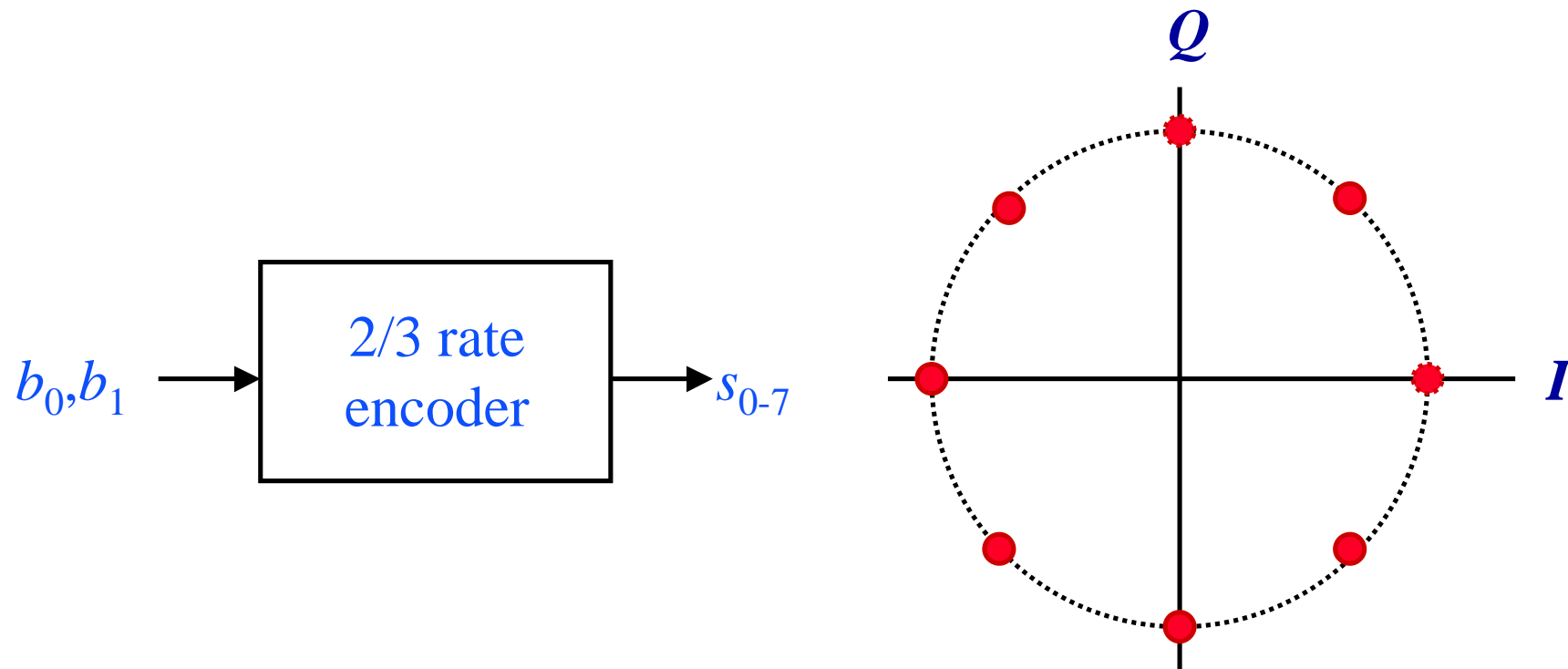


# Trellis coded modulation

- Combined coding and modulation
- Increase number of constellation points  $\Rightarrow$  data rate increases
- Use extra capacity for coding
- Coding gain compensates for reduction in symbol distance
- Proper code mapping on symbols
- Based on Euclidean distance rather than on Hamming distance



# Trellis coded modulation



# FOR NEXT TIME

- **Read:**
  - Chapter 5: §5.10**
  - Chapter 6: §6.11**
  - Chapter 8: §8.1-8.6, 8.7 (not 8.7.2 and 8.7.3)**
- **Solve problems:**
  - Chapter 5: 5.30**
  - Chapter 6: 6.2, 6.4, 6.5, 6.7,**

