



Helsinki University of Technology  
Signal Processing Laboratory

**S-38.411 Signal Processing in Telecommunications I**  
Spring 2000  
Lecture 4: Optimal linear equalizers for linear channels 1

---

*Prof. Timo I. Laakso*  
*timo.laakso@hut.fi, Tel. 451 2473*  
<http://wooster.hut.fi/studies.html>

## Timetable

---



- L1 Introduction; models for channels and communication systems
- L2 Channel capacity
- L3 Transmit and receive filters for bandlimited AWGN channels
- L4 Optimal linear equalizers for linear channels 1**
- L5 Optimal linear equalizers for linear channels 2
- L6 Adaptive equalizers 1
- L7 Adaptive equalizers 2
- L8 Nonlinear receivers 1: DFE equalizers
- L9 Nonlinear receivers 2: Viterbi algorithm
- L10 GL1: DSP for Fixed Networks / *Matti Lehtimäki, Nokia Networks*
- L11 GL2: DSP for Digital Subscriber Lines / *Janne Väinänen, Tellabs*
- L12 GL3: DSP for CDMA Mobile Systems / *Kari Kalliojärvi, NRC*
- L13 Course review, questions, feedback
- E 24.5. (Wed) 9-12 S4 **Exam**

## Contents of Lecture 3

---



Optimal linear equalizers for linear channels 1

I. Generalized matched filter

II. GMF with Nyquist criterion

III. Nyquist only: Zero-forcing equalization



Helsinki University of Technology  
Signal Processing Laboratory

### **I. Generalized matched filter**

---

## Generalized Matched Filter

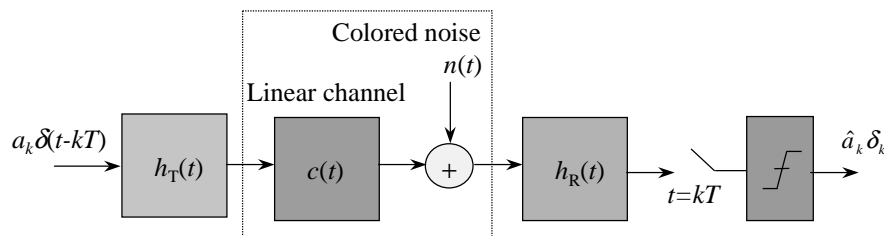


- ◆ In the previous lecture, we considered transmit and receive filter design for AWGN channels
- ◆ Root-Nyquist filters combine the matched filter (max SNR) and the Nyquist criterion (zero ISI) in AWGN channel
- ◆ Topic of this lecture:  
*How to generalize these ideas for a linear channel with colored noise spectrum?*
- ◆ Terminology: receiver processing for compensating for linear channel effects is called *equalization*

## Generalized Matched Filter...



- ◆ System model:



## Generalized Matched Filter...



◆ Notation:  $x(t) = \sum_k a_k \delta(t - kT)$ ,  $r(t) = h_T(t) * c(t) * x(t) + n(t)$

$$y(t) = h_R(t) * r(t) = h_R(t) * c(t) * h_T(t) * x(t) + h_R(t) * n(t)$$
$$\equiv g(t) + n_R(t)$$

$x(t)$  = input signal (symbol sequence)

$h_T(t), h_R(t)$  = transmit and receive filters

$c(t)$  = channel impulse response

$n(t)$  = additive Gaussian noise (colored):  $S_n(f) = \frac{N_0}{2} S_{n_0}(f)$

Normalization:  $\int_{-\infty}^{\infty} S_{n_0}(f) df = 2$

## Generalized Matched Filter...



Assumptions:

- ◆ Tx filter  $h_T(t)$  is fixed
- ◆ Rx filter  $h_R(t)$  is to be optimized
- ◆ Optimization criterion: max SNR at Rx
- ◆ Channel  $c(t)$  and noise power spectrum  $S_n(f)$  known at Rx

## Generalized Matched Filter...



- ◆ Pulse waveform after receive filter (without noise):

$$g(t) = h_T(t) * c(t) * h_R(t) = \int_{-\infty}^{\infty} H_T(f) C(f) H_R(f) e^{j2\pi ft} df$$

- ◆ Pulse energy at sampling instant:

$$g^2(0) = \left| \int_{-\infty}^{\infty} H_T(f) C(f) H_R(f) df \right|^2$$

- ◆ Noise power (after Rx filter):

$$E[n_R^2(t)] = \frac{N_0}{2} \int_{-\infty}^{\infty} |H_R(f)|^2 S_{n_0}(f) df = \frac{N_0}{2} \int_{-\infty}^{\infty} |H_R(f) \sqrt{S_{n_0}(f)}|^2 df$$

## Generalized Matched Filter...



- ◆ Resulting SNR:

$$SNR = \frac{g^2(0)}{E[n_R^2(t)]} = \frac{\left| \int_{-\infty}^{\infty} H_T(f) C(f) H_R(f) df \right|^2}{\frac{N_0}{2} \int_{-\infty}^{\infty} |H_R(f) \sqrt{S_{n_0}(f)}|^2 df}$$

- ◆ Use Schwarz inequality:

$$\begin{aligned} SNR &\leq \frac{\int_{-\infty}^{\infty} |H_T(f) C(f) / \sqrt{S_{n_0}(f)}|^2 df \int_{-\infty}^{\infty} |H_R(f) \sqrt{S_{n_0}(f)}|^2 df}{\frac{N_0}{2} \int_{-\infty}^{\infty} |H_R(f) \sqrt{S_{n_0}(f)}|^2 df} \\ &= \frac{2}{N_0} \int_{-\infty}^{\infty} |H_T(f) C(f) / \sqrt{S_{n_0}(f)}|^2 df = SNR_{MAX} \end{aligned}$$

## Generalized Matched Filter...



- ◆ Max SNR obtained when:

$$H_R(f)\sqrt{S_{n_0}(f)} = k_0 \left[ \frac{H_T(f)C(f)}{\sqrt{S_{n_0}(f)}} \right]^*$$

$$\Leftrightarrow H_R(f) = k_0 \frac{H_T^*(f)C^*(f)}{S_{n_0}(f)}$$

- ◆ GMF waveform:

$$\begin{aligned} h_R(t) &= F^{-1} \left\{ k_0 \frac{H_T^*(f)C^*(f)}{S_{n_0}(f)} \right\} \\ &= k_0 h_T(-t) * c(-t) * n_1(t) \end{aligned}$$

## Generalized Matched Filter...



- ◆ GMF waveform interpretation:

$$h_R(t) = k_0 h_T(-t) * c(-t) * n_1(t)$$

$k_0$  = constant

$h_T(-t)$  = pulse matched filter

$c(-t)$  = channel matched filter

$n_1(t)$  = noise compensation (NOT whitening!)

## Generalized Matched Filter...

---



- ◆ Example of GMF use: RAKE receiver in CDMA
  - chip-level pulse shaping (Tx) & matched filter (Rx)
  - signal spreading with code (Tx) & code-matched filter (Rx)
  - channel (Ch) & channel-matched filter or RAKE (Rx)
- ◆ Possible because ISI can be neglected
  
- ◆ Usual problem: ISI! (Not considered by MF at all!)



## II. GMF with Nyquist Criterion

---

## GMF with Nyquist criterion



Assumptions:

- ◆ Tx filter  $h_T(t)$  and Rx filter  $h_R(t)$  are to be *jointly optimized*
- ◆ Optimization criterion: max SNR at Rx with zero ISI constraint (= Nyquist criterion)
- ◆ The Nyquist spectrum  $G_N(f)$  is chosen (e.g. raised-cosine) and normalized so that peak pulse at Rx  $g_N(0) = 1$
- ◆ Channel  $c(t)$  and noise power spectrum  $S_n(f)$  are known both at Tx and Rx

## GMF with Nyquist...



- ◆ Nyquist constraint:

$$G(f) = G_N(f) = H_T(f)C(f)H_R(f)$$

$$\Leftrightarrow H_T(f) = \frac{G_N(f)}{C(f)H_R(f)} \quad (1)$$

- ◆ GMF solution:

$$H_R(f) = \frac{H_T^*(f)C^*(f)}{S_{n0}(f)} \quad (2)$$



## GMF with Nyquist...



- ◆ Combined solution (linear-phase Rx):

$$H_T(f) = \frac{\sqrt{G_N(f)S_{n0}(f)}}{C(f)}, \quad H_R(f) = \sqrt{\frac{G_N(f)}{S_{n0}(f)}}$$

- ◆ Pulse spectrum  $G(f) = G_N(f)$ ,  $g_N(0) = 1$
- ◆ Noise PSD at Rx output:  $S_{n,R}(f) = \frac{N_0}{2} G_N(f)$
- ◆ Noise power:  $E[n_R^2(t)] = \frac{N_0}{2} \int_{-\infty}^{\infty} G_N(f) df = \frac{N_0}{2}$

## GMF with Nyquist...



- ◆ SNR after Rx:

$$SNR = \frac{g^2(0)}{E[n_R^2(t)]} = \frac{2}{N_0}$$

- ◆ Hence, the SNR is the same as that of an AWGN channel!!!
- ◆ The joint design of Tx and Rx filters with GMF&Nyquist thus completely compensates for channel effects!
- ◆ Problems:
  - channel needs to be known at Rx&Tx
  - Tx power increase for low-gain channels
  - $C(f) = 0$ : Tx filter non-realizable!



### III. Nyquist only: Zero-forcing equalization

---

### Nyquist only: Zero-forcing equalization

---



Assumptions:

- ◆ Tx filter  $h_T(t)$  is fixed
- ◆ Rx filter  $h_R(t)$  is to be optimized
- ◆ Optimization criterion: zero ISI at Rx (Nyquist)  
( $\rightarrow$  Noise completely neglected in the design!)
- ◆ Channel  $c(t)$  and noise power spectrum  $S_n(f)$  known at Rx

## Nyquist only: ZF equalization...



- ◆ Composite pulse spectrum to be Nyquist:  $G(f) = G_N(f)$   
→ Solution for Rx filter directly:

$$H_R(f) = \frac{G_N(f)}{H_T(f)C(f)}$$

- ◆ Assume root-Nyquist Tx filter:  $H_T(f) = \sqrt{G_N(f)}$

$$\rightarrow H_R(f) = \frac{\sqrt{G_N(f)}}{C(f)}$$

## Nyquist only: ZF equalization...



- ◆ Noise power:

$$E[n_R^2(t)] = \frac{N_0}{2} \int_{-\infty}^{\infty} |H_R(f)|^2 S_{n_0}(f) df = \frac{N_0}{2} \int_{-\infty}^{\infty} \frac{|G_N(f)| S_{n_0}(f)}{|C(f)|^2} df$$

- ◆ SNR:

$$SNR = \frac{g^2(0)}{E[n_R^2(t)]} = \frac{1}{\frac{N_0}{2} \int_{-\infty}^{\infty} \frac{|G_N(f)| S_{n_0}(f)}{|C(f)|^2} df}$$

## Nyquist only: ZF equalization...

---



- ◆ Problems of the ZF Equalizer:
  - noise enhancement for low channel gain (small values of  $C(f)$ )
  - $C(f) = 0$ : ZF equalizer impossible to implement
- ◆ In general, employing exact Nyquist criterion in practical equalizers is problematic
- ◆ Develop other design criteria!

## Summary

---



Today we discussed:

Optimal linear equalizers for linear channels I

I. Generalized matched filter

II. GMF with Nyquist criterion

III. Nyquist only: Zero-forcing equalization

Next week: Optimal linear equalizers for linear channels II

- ◆ MMSE equalization
- ◆ Discrete-time finite-length FIR Equalizers