

# Intermediate Evaluation

## LELEC2103

Bronchain Olivier    Schellekens Vincent

Ecole Polytechnique de Louvain

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Symbol timing  
recovery

Maximum energy  
Direct maximization  
Earlygate  
Results  
Error static  
Constellations

Channel  
Estimation and  
Equalization

# Outline

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## Symbol timing recovery

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## Channel Estimation and Equalization

# Symbol timing recovery

Received signal in discrete time after the matched filter is given by:

$$y[n] = \sqrt{E_x} \alpha e^{j\theta} \sum_m s[m] g((n-m)T - \tau_d) + v[n] \quad (1)$$

$$\begin{aligned} y[n] = & \sqrt{E_x} \alpha s[n] g(\tau_d) \\ & + \sqrt{E_x} \alpha e^{j\theta} \sum_{m \neq n} s[m] g((m-n)T - \tau_d) \\ & + v[n] \end{aligned} \quad (2)$$

There is symbol interference due to  $\tau_d$ .

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## Channel Estimation and Equalization

# Maximum energy

We define energy as

$$\begin{aligned} J(\tau) &= E|y(nT + \tau)|^2 \\ &= \alpha^2 E_x \sum_m |g(mT + \tau - \tau_d)|^2 + \sigma_v^2 \end{aligned} \quad (3)$$

There is a maximum pour  $\tau - \tau_d = 0$ . We try to find  $\hat{\tau}$  such that

$$\hat{\tau} = \operatorname{argmax}_{\tau} J(\tau) \quad (4)$$

In practice we are in discrete time so:

$$\hat{\tau} = \frac{kT}{M} \quad k \in [0..M-1]$$

$$J[k] = E \left| r(nT + \frac{kT}{M}) \right|^2 \quad (5)$$

We can find the energy over  $P$  symbols and get

$$J_{approx}[k] = \frac{1}{P} \sum_{p=0}^{P-1} \left| r(pT + \frac{kT}{M}) \right|^2 \quad (6)$$

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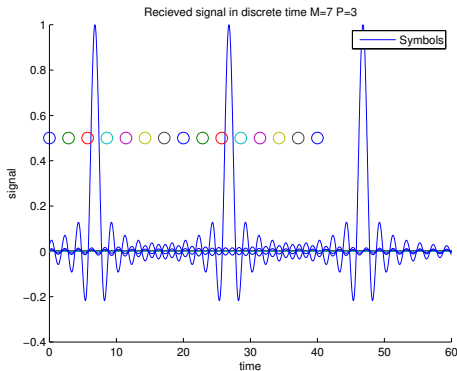
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# Direct maximization

We find the maximum energy with

$$\hat{k} = \underset{k[0..M-1]}{\operatorname{argmax}} J_{\text{approx}}[k] \quad (7)$$



# Early gate

Now we will try to find the maximum by canceling the derivative.

$$\begin{aligned}\frac{d}{d\tau} J(\tau) &\simeq E\left(\frac{d}{d\tau} |y(nT + \tau)|^2\right) \\ &\simeq \frac{1}{P} \sum_{p=0}^{P-1} 2\text{Re}(y(pT + \tau)(y^*(pT + \tau + \delta) - y^*(pT + \tau - \delta)))\end{aligned}\tag{8}$$

In discrete time we get

$$J_\delta[k] = \frac{1}{P} \sum_{p=0}^{P-1} 2\text{Re}(r[pM + k](r^*[pM + k + \delta] - r^*[pM + k - \delta]))\tag{9}$$

$$\hat{k} = \underset{k \in [0..M-1]}{\text{argmin}} J_\delta[k]$$



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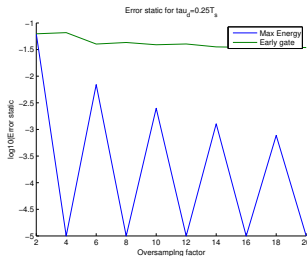
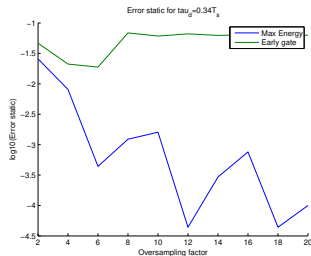
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## Channel Estimation and Equalization

# Error static

We define the error static as:

$$\epsilon[M] = E(||\frac{\hat{\tau}(M) - \tau_d}{T_s}||^2) \quad (10)$$



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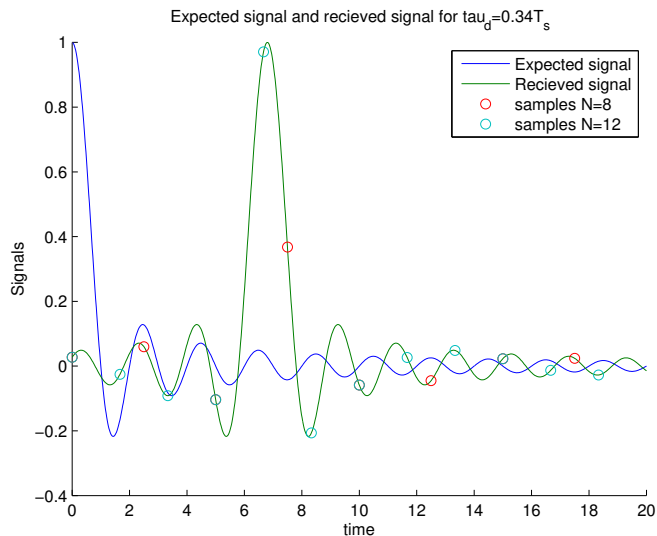
**Error static**

Constellations

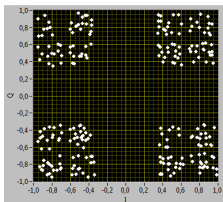
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# Error static

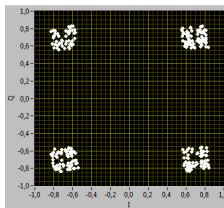
The shape of error static for direct maximization is due to the delay and the oversampling factor.



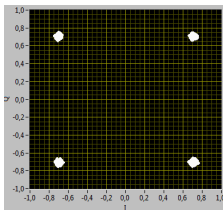
# Constellations



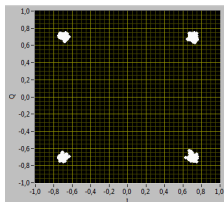
(a)  $M = 2$



(b)  $M = 4$



(c)  $M = 10$



(d)  $M = 20$

Figure: Constellation for direct maximization

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# Channel estimation and equalization

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Channel distortion ( $h(t) \neq \delta(t)$ ) so received signal suffers from ISI :

$$y[n] = h[0]s[n] + \sum_{m \neq n} s[m]h[n - m] + v[n] \quad (11)$$

- ▶ Goal : reduce effect of channel (apply "inverse filter") = *equalization*.
- ▶ Equalization needs the channel response before = *channel estimation*.

Use a *training sequence* to estimate the channel.

Both methods use a *least-squares approximation* method : expensive!

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# Direct least-squares equalization

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*Direct method* : apply channel estimation and equalization at once! Only 1 LLS.

$$\sum_{l=0}^{L_f} f[l]y[n + n_d - l] = t[n] \quad , \quad n = 0 \dots N_t \quad (12)$$

Estimate filter parameters  $f[0] \dots f[L_f]$  by creating a filter that matches training sequence  $t$  from the received signal  $y$ .

Note :

- ▶  $n_d$  = filter delay
- ▶  $L_f$  = filter length

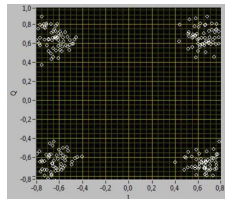
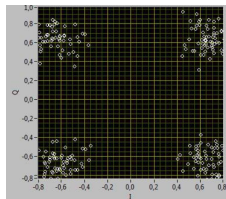
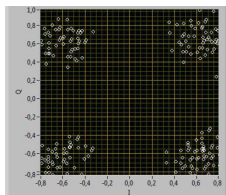
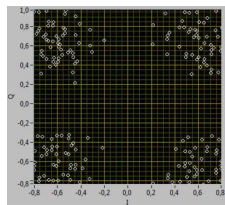
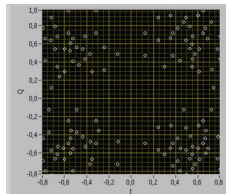
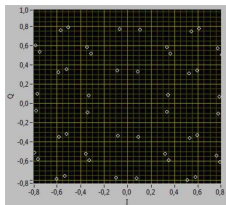
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# Simulation : influence of channel length

Increasing  $L_f$  from 1 to 6 (better estimations)



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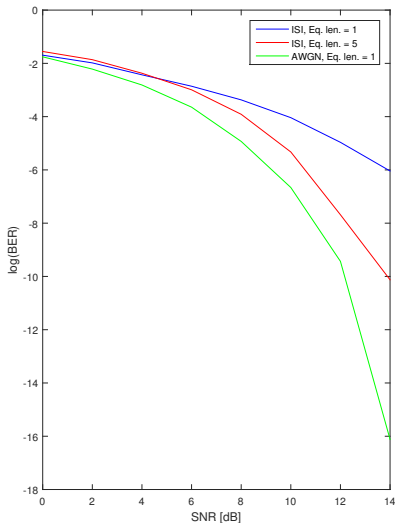
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# Simulation : influence of noise

Noise on the training sequence corrupts the equalizer and propagates to all symbols!





# Experiment : effect of channel

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No equalization! Constellation shifted + scaled.

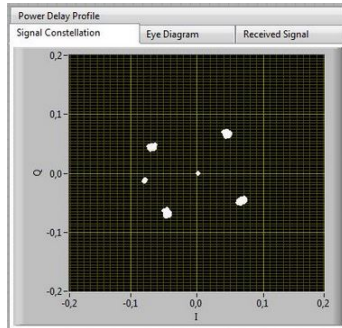
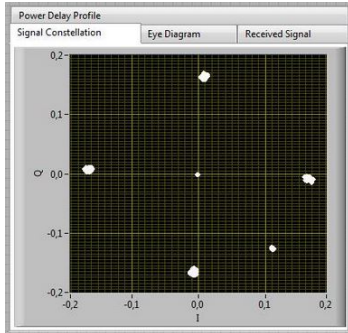


Figure: Received constellation without equalizer.

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