MIMO Systems: Non-Linear Equalisation Techniques

Dr. Waleed Al-Hanafy waleed_alhanafy@yahoo.com Faculty of Electronic Engineering, Menoufia Univ., Egypt

Adaptive DSP course for MSc & PhD students - Lecture no. 3

May 21, 2011

Dr. Waleed Al-Hanafy

 < □ > < □ > < □ > < ⊇ > < ⊇ > < ⊇ > < ⊇ < ○ ○</td>

 Adaptive DSP course for MSc & PhD students — Lecture no.



1 Maximum-Likelihood Detection

2 Decision Feedback Equalisation

3 BER Performance

4 Conclusion and Next Lecture

Dr. Waleed Al-Hanafy

 < □ > < ⊡ > < ⊡ > < ⊡ > < ⊡ > < ⊡ > < ⊡ > < ⊡ > < ⊡ >

 Adaptive DSP course for MSc & PhD students — Lecture no.

Maximum-likelihood detection (MLD)

- MLD is the optimum detection scheme as it optimally takes into account the properties of noise and interference [1]
- MLD receivers detect transmitted data symbols s ∈ S^{Nt} on a per-vector basis by estimating the most probable transmitted data vector ŝ amongst all possible combinations S^{Nt} upon receiving y = Hs + v ∈ C^{Nr} such that

$$\hat{\mathbf{s}} = \underset{\mathbf{s} \in \mathcal{S}^{N_t}}{\operatorname{argmin}} \|\mathbf{y} - \mathbf{H}\mathbf{s}\|_2^2, \tag{1}$$

- Obviously, MLD requires an exhaustive search of all possible M^{N_t} different data vectors to find the solution in (1) for every single vector detection
- This of course restricts the application of the MLD scheme for practical use as the complexity increases dramatically with the number of antennas N_t and the constellation size M
- In other words, MLD is not feasible for large orders of MIMO systems even with smaller modulation orders such as BPSK [2, 1]

э

Decision Feedback Equalisation (DFE)

- DFE is a simple and popular conventional non-linear technique that is established to separate data streams at the receiver of MIMO systems using successive interference cancellation
- This is shown to overcome the disadvantages of noise enhancement associated with linear equalisation [3] at the cost of extra complexity
- DFE was originally developed to combat ISI of SISO systems, i.e. temporal equalisation, (see e.g. [4, 5]) where previously detected symbols are used to assist in subsequent symbols detection
- Spatial DFE, in contrast, arises for MIMO system to deal with the multiuser interference
- A typical DFE system model is depicted in the figure below where the received data vector y is linearly processed by the feedforward filter matrix
 F before being considered by the non-linear feedback loop

Dr. Waleed Al-Hanafy

э

BER Performance

Conclusion and Next Lecture

DFE system model



The undecided symbol $\tilde{\mathbf{s}}$ of the feedback loop is given by

$$\tilde{\mathbf{s}} = \mathbf{F}\mathbf{y} + \mathbf{B}\hat{\mathbf{s}} = \mathbf{F}\mathbf{H}\mathbf{s} + \mathbf{F}\mathbf{v} + \mathbf{B}\hat{\mathbf{s}},\tag{2}$$

where $\hat{\mathbf{s}}$ combines the decided estimates of \mathbf{s} using the appropriate quantisation or decision device $q\left(\cdot\right)$

- For feasible realisability and to ensure spatial causality, the feedback filter matrix **B** must be of strictly triangular structure
- This can be achieved using the well-known QR factorisation of the channel matrix **H**, that is $\mathbf{H} = \mathbf{QR}$ where $\mathbf{Q} \in \mathbb{C}^{N_r \times N_r}$ is a unitary matrix (i.e., $\mathbf{QQ}^{\mathrm{H}} = \mathbf{Q}^{\mathrm{H}}\mathbf{Q} = \mathbf{I}$) and $\mathbf{R} \in \mathbb{C}^{N_r \times N_t}$ is an upper triangular matrix

DFE analysis

- For simplicity, a MIMO system with equal numbers of transmit and receive antennas $N_t = N_r = N$ is considered
- Assuming perfect decisions of $\tilde{\mathbf{s}}$, i.e. $\hat{s}_i = q(\tilde{s}_i) = s_i, 1 \le i \le N$, which is a common assumption in DFE systems [6] called a "genie-aided" approach, the ZF solution can be formulated using (2) as

$$\begin{array}{rcl} \mathbf{F}\mathbf{H} + \mathbf{B} &= & \mathbf{I} \\ \mathbf{F}\mathbf{Q}\mathbf{R} + \mathbf{B} &= & \mathbf{I} \end{array} \tag{3}$$

Setting the feedforward filter F = GQ^H in (3), results in the feedback filter B = I - GR where G is a diagonal matrix that is used to set the diagonal entries of R to unity, i.e.

$$\mathbf{G} = \operatorname{diag}\left(\mathbf{r}_{11}^{-1}, \cdots, \mathbf{r}_{NN}^{-1}\right)$$
(4)

Dr. Waleed Al-Hanafy

Adaptive DSP course for MSc & PhD students — Lecture no.

イロト イヨト イヨト イヨト

э

DFE analysis (cont'd)

With the absence of noise and by substituting these filter settings for F and B into (2) yields s as

$$\tilde{\mathbf{s}} = \begin{bmatrix} 1 & -b_{12} & \cdots & -b_{1N} \\ 0 & \ddots & \ddots & \vdots \\ \vdots & \ddots & \ddots & -b_{N-1N} \\ 0 & \cdots & 0 & 1 \end{bmatrix} \mathbf{s} + \begin{bmatrix} 0 & b_{12} & \cdots & b_{1N} \\ \vdots & \ddots & \ddots & \vdots \\ \vdots & \ddots & \ddots & \vdots \\ 0 & \cdots & \cdots & 0 \end{bmatrix} \hat{\mathbf{s}}$$
(5)

- Using (5), it is easy to note that the last-indexed symbol s_N of the transmitted vector **s** is an error-free symbol. This is utilised in detecting the spatially previous symbol s_{N-1} by subtracting out its interference signature on the statistics of \tilde{s}_{N-1}
- Proceeding further, both s_N and s_{N-1} are used to cancel their interference contributions from \tilde{s}_{N-2} and so forth up to detecting the first-indexed symbol s_1

イロン イ理 とく ヨン イヨン

э

Results

A 4 \times 4 MIMO system with 16-QAM transmission is considered. It is clearly noted that BER performance of the non-linear DFE system outperforms linear equalisation of ZF and MMSE, also the theoritical DFE genie-aided performance is shown for comparison



Dr. Waleed Al-Hanafy

Adaptive DSP course for MSc & PhD students - Lecture no. 3

э

Conclusion

Concluding remarks

- Non-linear equalisation techniques are introduced for better performance than linear methods
- Both maximum-likelihood detection (MLD) and decision feedback equalisation (DFE) are given
- Simulation results comparisons are shown
- Next another non-linear detection approach called V-BLAST will be studied

Dr. Waleed Al-Hanafy

イロト イ団ト イヨト イヨト Adaptive DSP course for MSc & PhD students - Lecture no

G. K. Psaltopoulos, M. Joham, and W. Utschick, "Generalized MMSE Detection Techniques for Multipoint-to-Point Systems," in *IEEE Global Telecommunications Conference, GLOBECOM 06*, San Francisco, CA, USA, Nov. 2006, pp. 1–5.



J. Jalden and B. Ottersten, "On the complexity of sphere decoding in digital communications," *IEEE Transactions on Signal Processing*, vol. 53, no. 4, pp. 1474–1484, Apr. 2005.



R. Fischer, C. Windpassinger, A. Lampe, and J. Huber, "Space-Time Transmission using Tomlinson-Harashima Precoding," in *4th International ITG Conference on Source and Channel Coding, Berlin*, Jan. 2002.





M. R. Gibbard and A. B. Sesay, "Asymmetric Signal Processing for Indoor Wireless LAN's," *IEEE Transactions on Vehicular Technology*, vol. 48, no. 6, pp. 2053–2064, Nov. 1999.



O. Simeone, Y. Bar-Ness, and U. Spagnolini, "Linear and Nonlinear Preequalization/Equalization for MIMO Systems with Long-Term Channel State Information at the Transmitter," *IEEE Transactions on Wireless Communications*, vol. 3, no. 2, pp. 373–378, Mar. 2004.

(日)