

Equalizer Variants for Discrete Multi-Tone (DMT) Modulation

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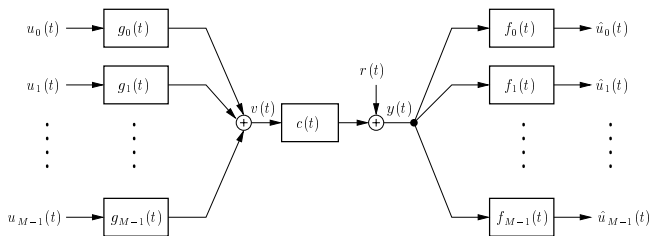


Never stop thinking

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Introduction to Multi-Carrier (MC) Systems



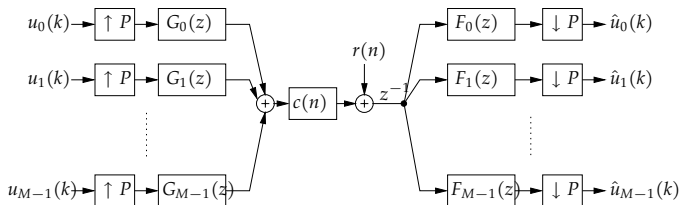
- split a wide-band, frequency-selective channel into large number of small-band, assumed flat subchannels for simplified equalization
- robust to small-band interferers and impulse noise
- optimal power and bit allocation according to channel characteristics → best suited for DSM

A Short History on MC Systems

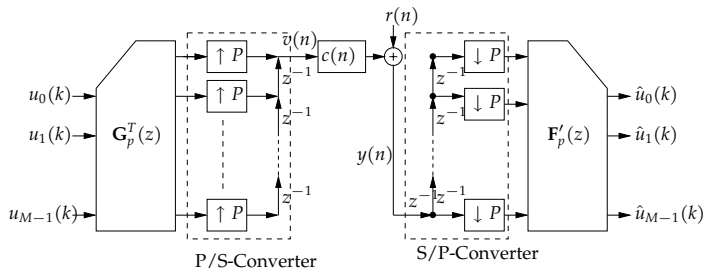
- **algorithms** known since the 1960's
- first Multi-Carrier modems in **conventional frequency-multiplex technology**: analog filters for band separation, poor bandwidth efficiency
- **staggered QAM (SQAM)** systems: close to 100 percent bandwidth efficiency, overlap at f_{3dB} → constant sum spectrum, interference to the direct neighbors, orthogonality due to alternating in-phase and quadrature modulation, less than 20 subcarriers
- large number of subcarriers with **Orthogonal Multi-Carrier (OMC)**: band pass filters with si-like spectrum, complex modulated filterbank with rectangular prototype filter → **OFDM, DMT**
- **Discrete Wavelet Multi-Tone (DWMT)**: cosine-modulated filterbanks, inter-channel interference reduced to a minimum

The Multi-Carrier Transmission Scheme

- discrete MC system, $P \geq M$



- equivalent polyphase representation of the basis filters

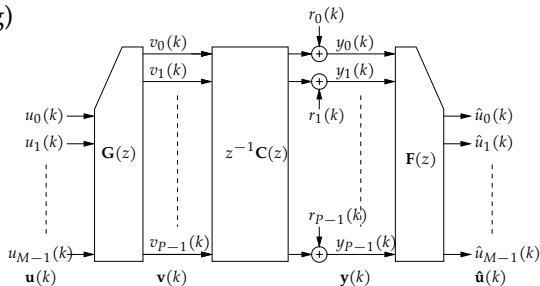


The MC Transmission Scheme (cont'd)

- Combining polyphase representation of channel impulse response and P/S, S/P converters to circular polyphase matrix $\mathbf{C}(z)$ plus additional delay

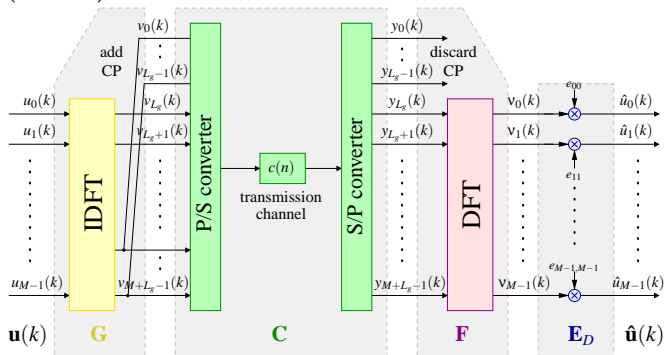
$$\mathbf{C}(z) = \begin{bmatrix} C_0(z) & z^{-1}C_{P-1}(z) & \cdots & z^{-1}C_1(z) \\ C_1(z) & C_0(z) & & z^{-1}C_2(z) \\ \vdots & & \ddots & \vdots \\ C_{P-1}(z) & C_{P-2}(z) & \cdots & C_0(z) \end{bmatrix}$$

- Introducing redundancy: $P = M + L$ with $L \geq 0$ ($L = 0$ → critical sampling)



Discrete Multi-Tone (DMT) Modulation

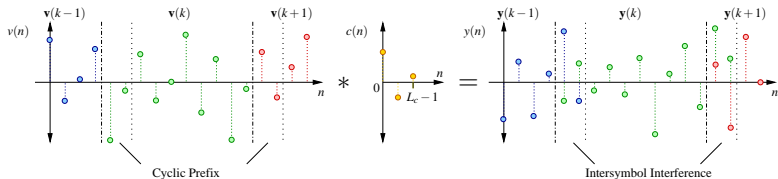
- Multi-Carrier transmission scheme based on IDFT/DFT \rightarrow basic structure similar to Orthogonal Frequency Division Multiplexing (OFDM) for wireless transmission



- application examples: ADSL_x, VDSL_x, WLAN, 3G, DVB-T, DAB, UWB, Powerline, ...

The Cyclic Prefix (CP)

- repeat last L_g samples at the beginning of the symbol



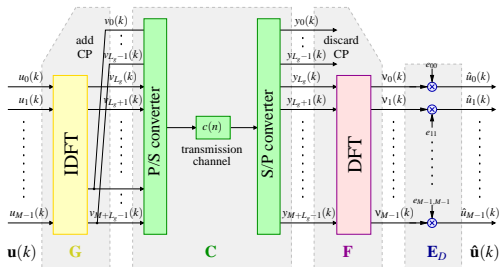
- Perfect equalization in a noise-free environment, if

$$L_g \geq L_c - 1$$

(L_g - length of cyclic prefix, L_c - length of channel impulse response)

- Strong Intersymbol and Intercarrier Interference (ISI/ICI) if above criterion is not fulfilled

Transfer function of a DMT system



→ transfer function in polyphase and block matrix notation:

$$\hat{\mathbf{U}}(z) = \mathbf{E}(z) \cdot \mathbf{F}(z) \cdot z^{-1} \cdot \mathbf{C}(z) \cdot \mathbf{G}(z) \cdot \mathbf{U}(z)$$



$$\hat{\mathbf{u}}(k) = \mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C} \cdot \mathbf{G} \cdot \mathbf{u}^{(n)}(k-1)$$

(n – number of interfering symbols)

Inter-Symbol/Inter-Carrier Interference

$$\hat{\mathbf{u}}(k) = \underbrace{\mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C} \cdot \mathbf{G}}_{\mathbf{T}} \cdot \mathbf{u}^{(n)}(k-1)$$

Sufficient CP: $L_g \geq L_c - 1$

- $n = 1 \rightarrow$ no ISI
- cyclic prefix \rightarrow sequential convolution with channel impulse response becomes virtually cyclic \rightarrow no ICI

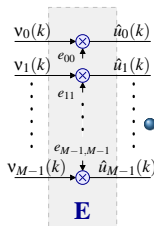
Insufficient CP: $L_g < L_c - 1$

- $n > 1 \rightarrow$ (severe) ISI
- no longer cyclic convolution \rightarrow (severe) ICI

ISI/ICI cont'd

Equalizer Matrix for Sufficient CP

$$\mathbf{T} = \mathbf{E} \cdot \mathbf{H} = \mathbf{E} \cdot \mathbf{D} \stackrel{!}{=} \mathbf{I}$$

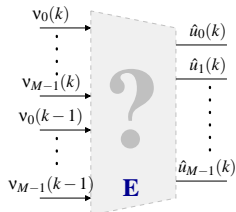


- \mathbf{D} diagonal matrix, solution $\mathbf{E} = \mathbf{D}^{-1}$ with $e_{ii} = 1/C(e^{j2\pi i/M})$
- Efficient equalization with only one complex multiplication per tone

Equalizer Matrix for Insufficient CP

$$\mathbf{T} = \mathbf{E} \cdot \mathbf{H} \stackrel{!}{=} \begin{bmatrix} \mathbf{0} & \dots & \mathbf{0} & \mathbf{I} & \mathbf{0} & \dots & \mathbf{0} \end{bmatrix}_n$$

- Solution only if \mathbf{E} takes neighboring symbols into account
- \mathbf{E} very big and no sparse structure



Extracting ISI/ICI Part from Channel Matrix \mathbf{C}

- Assumption: no Cyclic Prefix, $L_c \leq M$, no pre-cursor
 \rightarrow ISI from the preceding symbol

$$\hat{\mathbf{u}}(k) = \mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C} \cdot \mathbf{G} \cdot \begin{bmatrix} \mathbf{u}(k-2) \\ \mathbf{u}(k-1) \end{bmatrix}$$

Extracting ISI/ICI Part (cont'd)

⇒ \mathbf{C} can be split into ideal, cyclic part \mathbf{C}_{cycl} and ISI/ICI error part \mathbf{C}_{err}

$$\mathbf{C} = [\mathbf{C}_0 \quad \mathbf{C}_1] = \underbrace{[\mathbf{0}_M \quad (\mathbf{C}_0 + \mathbf{C}_1)]}_{\mathbf{C}_{\text{cycl}}} + \underbrace{[\mathbf{C}_0 \quad (-\mathbf{C}_0)]}_{\mathbf{C}_{\text{err}}}$$

⇒ Substitution into transfer function

$$\mathbf{E} \cdot \mathbf{H} = \mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C} \cdot \mathbf{G} = \mathbf{E} \cdot \mathbf{F} \cdot (\mathbf{C}_{\text{cycl}} + \mathbf{C}_{\text{err}}) \cdot \mathbf{G} \stackrel{!}{=} [\mathbf{0} \quad \mathbf{I}]$$

Extracting ISI/ICI Part (cont'd)

⇒ With $\mathbf{C}_{\text{cycl,red}} = \mathbf{C}_0 + \mathbf{C}_1$ and \mathbf{G}' as a diagonal block in \mathbf{G} , separation into two sub-systems possible

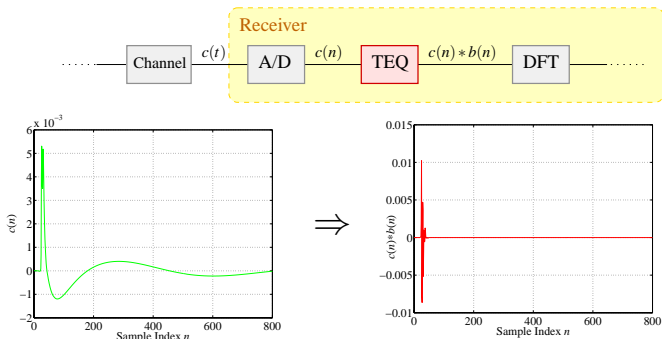
$$\text{I: } \mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C}_{\text{cycl,red}} \cdot \mathbf{G}' \stackrel{!}{=} \mathbf{I}$$

$$\text{II: } \mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C}_{\text{err}} \cdot \mathbf{G} \stackrel{!}{=} [\mathbf{0} \quad \mathbf{0}]$$

- Equation system **I** describes an ideal, distortion-free DMT system
- Equation system **II** eliminates ISI/ICI caused by \mathbf{C}_{err}

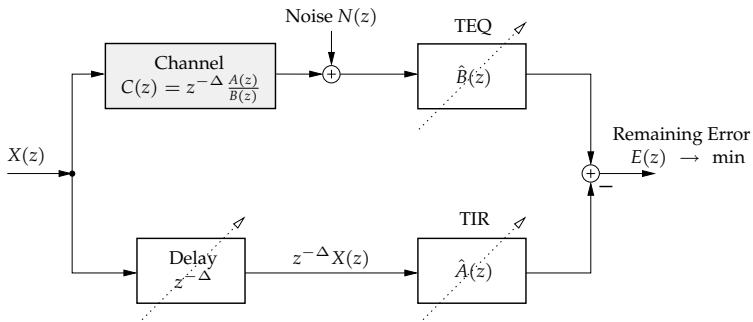
The Time-Domain Equalizer (TEQ)

- FIR filter applied before receiver FFT to shorten effective length of the channel impulse response



- filters at sampling rate → complexity!
- mandatory for at least ADSL, determines performance for shorter loops
- optimal adaptation of the TEQ coefficients in the SNR sense too costly

TEQ - MMSE Method



- adopt delay Δ , TEQ filter $\hat{B}(z)$ and Target Impulse Response (TIR) $\hat{A}(z)$ to **minimize** the **minimum mean square error** between the two branches $MSE = E[|e(k)|^2]$ with $e(k) \circ \bullet E(z)$
- first introduced by Falconer and Magee (1973) for channel shortening of a ML receiver

TEQ - MMSE, Variants

- Chow and Cioffi (1992) first applied for MC, to prevent trivial solution **Unit-Tap Constraint (UTC)** was introduced:

$$\hat{\mathbf{a}}^T \mathbf{e}_i = 1 \quad \text{with } \hat{\mathbf{a}} = [\hat{a}_0 \hat{a}_1 \cdots \hat{a}_{L_{\text{TIR}}-1}]^T$$

- UTC requires search over all i , matrix inversions and multiplications
- Al-Dhahir and Cioffi (1996) showed that the **Unit-Energy Constraint (UEC)**:

$$\hat{\mathbf{a}}^T \hat{\mathbf{a}} = 1$$

- always leads to equal or smaller MSE than UTC, no search over all i , no matrix inversion, but eigenvalue calculation required
- ⇒ high complexity due to extensive matrix operations
- ⇒ Lee, Chow and Cioffi (1995) proposed circulant correlation matrices → matrix operations using DFT/IDFT, but $L_{\text{TIR}} \geq L_{\text{TEQ}}$

TEQ - MMSE, Adaptation Methods

- Falconer, Magee, 1973: proposed **LMS** for adaptation, low complexity but slow
- Chow, Cioffi, Bingham, 1993: **Frequency-Domain LMS** and **Frequency Domain Division**, alternating between FD and TD, still slow convergence
- Melsa, Younce, Rohrs, 1996: **ARMA modelling** of the channel, **LS** or **RLS** solution, efficient variant: translation to **2-channel AR** model and solved with **Levinson-Wiggins-Robinson (LWR)** algorithm
- Wang, Adali, 1999: solve for MSE completely in the frequency domain, **weight factor for each tone** to exclude unused tones from optimization

TEQ - MSSNR Method

- effective channel impulse response incl. TEQ
 $c_{\text{eff}}(n) = c(n) * h_{\text{TEQ}}(n) \rightarrow \mathbf{c}_{\text{eff}} = [c_0 \ c_1 \ \dots \ c_{L_c+L_{\text{TEQ}}-1}]^T$ split into kernel segment \mathbf{c}_{win} and pre and post cursor \mathbf{c}_{wall}
- minimize ISI contributing energy $\mathbf{c}_{\text{wall}}^T \mathbf{c}_{\text{wall}}$, i.e. maximize the **Shortening SNR**

$$\text{SSNR [dB]} = 10 \cdot \log_{10} \frac{\mathbf{c}_{\text{win}}^T \mathbf{c}_{\text{win}}}{\mathbf{c}_{\text{wall}}^T \mathbf{c}_{\text{wall}}}$$

- originally proposed by Melsa, Younce and Rohrs (1996), optimal solution
- optimal solution, involves Cholesky decomposition, matrix inversion, Eigenvalue calculation
- not suited for application, serves as a reference

TEQ - MSSNR, DCC and DCM

- based on **Divide-and-Conquer** Ansatz, introduced by Lu, Clark, Arslan and Evans (2000)
- **Divide-and-Conquer**: TEQ filter of length L_{TEQ} is factorized into $L_{\text{TEQ}} - 1$ filters \mathbf{w}_i of length 2

$$\mathbf{w}_i = [1, g_i]^T$$

- g_i 's iteratively optimized using two different approaches:
Divide-and-Conquer by Cancellation (DCC) and
Divide-and-Conquer by Minimization (DCM)
- nearly optimal solution
- computationally efficient, suitable for practical implementation
- odd behavior: energy concentration in first TEQ filter taps

TEQ - MGSNR Method

- bit rate of a DMT system:

$$b_{\text{DMT}} = \sum_{i=0}^{N-1} \log_2 \left(1 + \frac{\text{SNR}_i}{\Gamma} \right) \quad \rightarrow \quad b_{\text{DMT}} = N \log_2 \left(1 + \frac{\overline{\text{SNR}}}{\Gamma} \right)$$

$$\text{with } \overline{\text{SNR}} = \Gamma \left(\left[\prod_{i=0}^{N-1} \left(1 + \frac{\text{SNR}_i}{\Gamma} \right) \right]^{\frac{1}{N}} - 1 \right) \approx \text{GSNR}$$

- maximize geometric mean GSNR of the SNR_i over all used tones
 - Al-Dhahir and Cioffi (1996) proposed suboptimal solution (due to some approximations)
 - Henkel, and Kessler (2000) take external noise into account, optimal TIR may be longer than cyclic prefix
 - Arslan, Evans and Kaiei (2001) derive more efficient Minimum-ISI method from nonlinear optimization problem
- ⇒ **all MGSNR methods far too complex for implementation**

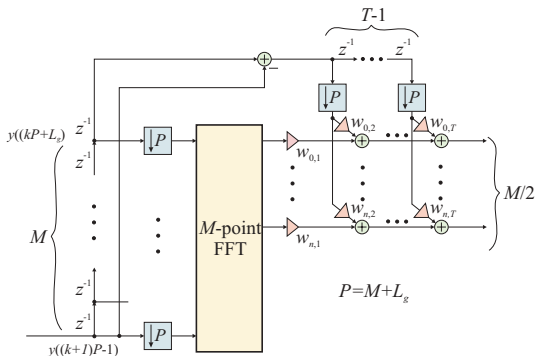
TEQ - "Recent" Methods

- Arslan, Lu, Clark, Evans, 2001: (Modified) Matrix pencil design method
- Farhang-Boroujeny, Ding, 2001: Eigen approach
- Martin, Johnson, Ding, Evans, 2003: Symmetric maximum shortening SNR

⇒ for further information have a look at:

<http://users.ece.utexas.edu/bevans/projects/adsl/dmtteq/dmtteq.html>

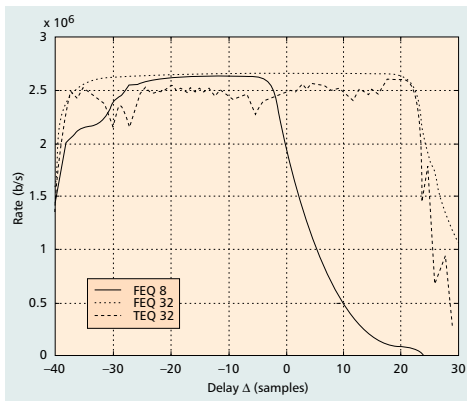
The Per-Tone Equalizer [Van Acker et al]



- transfer T -tap TEQ operation to FD
 - requires T -times sliding FFT
 - efficient realization with single FFT and subsequent "difference" terms
- separate T -tap FEQ for each tone
 - increased memory requirements
- similar complexity compared to TEQ

PTEQ (cont'd)

- N -times more coefficients to be initialized \rightarrow "tone grouping"
- efficient RLS-based method initialization method proposed, LMS for updates during runtime
- larger T always improves performance
- insensitive to delay parameter



Extracting ISI/ICI Part (cont'd)

⇒ With $\mathbf{C}_{\text{cycl,red}} = \mathbf{C}_0 + \mathbf{C}_1$ and \mathbf{G}' as a diagonal block in \mathbf{G} , separation into two sub-systems possible

$$\text{I: } \mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C}_{\text{cycl,red}} \cdot \mathbf{G}' \stackrel{!}{=} \mathbf{I}$$

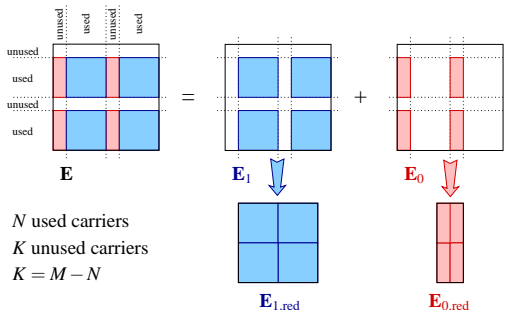
$$\text{II: } \mathbf{E} \cdot \mathbf{F} \cdot \mathbf{C}_{\text{err}} \cdot \mathbf{G} \stackrel{!}{=} [\mathbf{0} \quad \mathbf{0}]$$

- Equation system **I** describes an ideal, distortion-free DMT system
- Equation system **II** eliminates ISI/ICI caused by \mathbf{C}_{err}

Decomposing Equalizer Matrix \mathbf{E}

- Under assumption that K tones not used decomposition of equalizer matrix into

$$\mathbf{E} = \mathbf{E}_1 + \mathbf{E}_0$$



N used carriers
 K unused carriers
 $K = M - N$

→ \mathbf{E}_0 contains K columns of unused tone output samples

→ \mathbf{E}_1 contains $N = M - K$ columns of used tone output samples

Perfect Equalization Condition

⇒ After elimination of zero rows and columns equation system **I** independent from \mathbf{E}_0

$$\mathbf{E}_{1,\text{red}} \cdot \underbrace{\mathbf{F}_{1,\text{red}} \cdot \mathbf{C}_{\text{cycl},\text{red}} \cdot \mathbf{G}'_{\text{red}}}_{\mathbf{D}_{\text{red}}} \stackrel{!}{=} \mathbf{I}_N$$

- solution for **I** with $\mathbf{E}_{1,\text{red}} = \mathbf{D}_{\text{red}}^{-1} \rightarrow$ deg. of freedom in $\mathbf{E}_{0,\text{red}}$ used for solving **II** !
- ⇒ **Solution independent from channel frequency response at the unused carrier positions!**

Perfect Equalization Condition (cont'd)

- Solution for \mathbf{H} exists if

$$K + L_g \geq L_c - 1$$

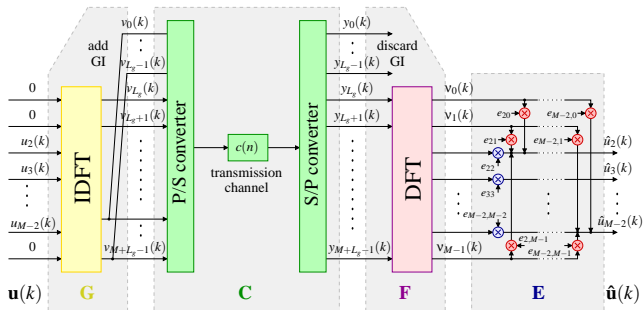
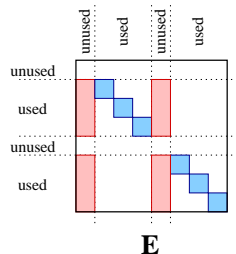
⇒ combination of TD and FD redundancy → may be arbitrarily distributed

- Special cases:

- $K = 0$: Traditional DMT/OFDM without usage of FD redundancy
- $L_g = 0$: No cyclic prefix, but symbol-separate, perfect equalization!

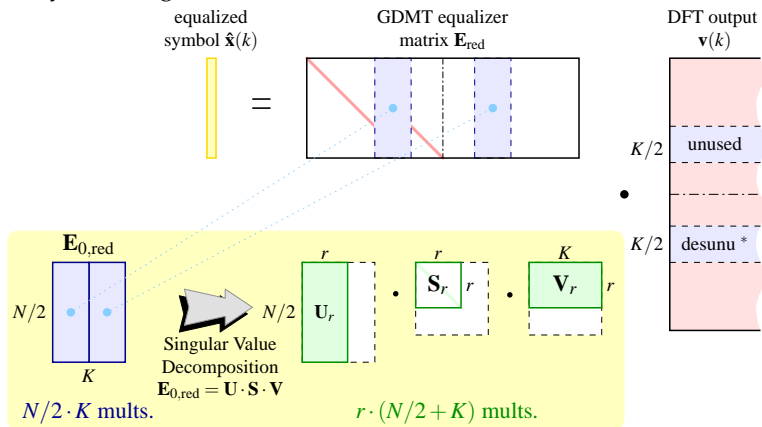
Generalized DMT [Trautmann et al]

- Transmitter similar to DMT, Receiver with slightly extended Equalizer \rightarrow Sparse Matrix \mathbf{E}
- Redundancy may be arbitrarily distributed to either time-domain (length of cyclic prefix), or frequency domain (number of unused subcarriers)



Complexity Reduction for GDMT?

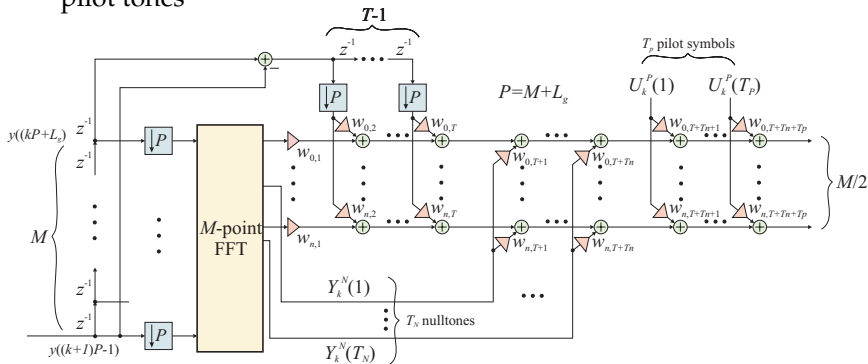
- SVD decomposition
- Only meaningful for the branches from the measurement tones



- Complexity reduced to $\frac{r \cdot (N/2 + K)}{N/2 \cdot K}$ (tends to r/K for $N \gg K$)

The Extended PTEQ [Vanbleu et al]

- extra FD redundancy with T_N nulltones = T_Z zero tones + T_P pilot tones



- perfect equalization for IIR channels $C(z) = \frac{A(z)}{B(z)} = \frac{\sum_{l=0}^{L_A-1} a_l z^{-l}}{\sum_{l=0}^{L_B-1} b_l z^{-l}}$ if

$$T_N + L_g \geq L_A - 1 \quad \text{and} \quad T \geq L_B$$

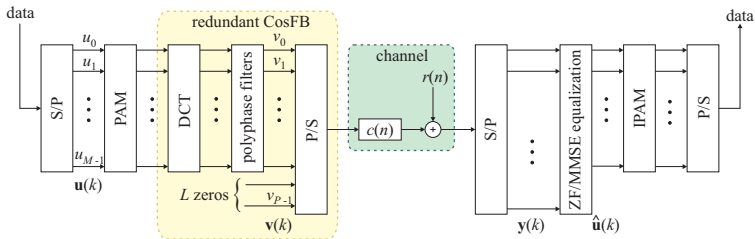
Other Methods

• Windowing/Pulse Shaping

- shape the rectangular-windowed DMT symbols at the edges to improve selectivity
- with some extra TD redundancy orthogonality can be kept
- also helps for RFI cancellation and echo suppression at the US/DS band edges
- standardized for VDSLx

• Alternative Transform Bases

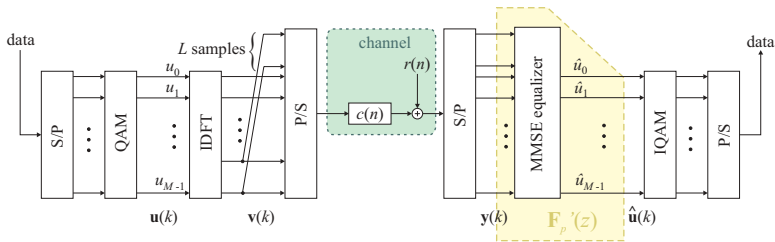
- overlapping basis filters \rightarrow pulse shaping
- example: Cos-Modulated Filterbanks (CMFB) \rightarrow DWMT, "wDSL"



- superior ISI/ICI robustness, even without cyclic prefix

Other Methods (cont'd)

• MIMO Equalizer



- insufficient or no cyclic prefix, combine inverse transform and equalizer into large rectangular matrix
- no sparse structure when combined with DMT transmitter
- **Fractional MIMO Equalizer**
 - instead of symbol-wise FFT, apply sliding FFT to the RX signal
 - FFT outputs at sampling rate, followed by MIMO equalizer → special case: PTEQ
 - similar to bank of N parallel filters → SIMO structure

Other Methods (cont'd)

- **DFE MIMO Equalizer**

- instead of cyclic prefix, use Decision-Feedback Equalizer (DFE) for full equalization
- difficult to apply for DMT, since decoding after the FFT
- efficient structures proposed by Al-Dhahir and Cioffi (1995-1997)

- **Redundant Filterbanks**

- general zero-forcing filterbanks with introduced redundancy
- channel impulse response must be shorter than $P = M + L$
- complexity

- **Transmitter Pre-Coding**

- pre-distort transmit symbol according to channel characteristics to simplify equalization at the receiver side
- Tomlinson-Harashima Pre-coding (THP) adopted for DMT with insufficient cyclic prefix by Cheong and Cioffi (1998)
- increased transmit power, increased Crestfactor

Conclusions and Outlook

- DFT as the transform base for DMT/OFDM was not the optimal choice in terms of spectral containment of the subchannels → Cyclic Prefix was introduced
 - further extensions to the original scheme (TEQ, Windowing, ...) necessary to improve spectral selectivity of the subchannels and thus to reduce ISI/ICI
 - extended FEQ methods like GDMT and PTEQ are able to also incorporate other tasks like RFI suppression, Echo cancellation, Windowing, Crestfactor reduction, ...
- ⇒ joint optimization to reduce the amount of required redundancy