Novel precoding algorithm for VDSL-2

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Abstract— We propose a novel concept of symbol relocation for the improvement of received signal power in diagonal precoder. In the past, many precoding algorithm have been proposed, they all suffer either in terms of low bit rate, high complexity and less received signal power. The proposed symbol relocation concept in diagonal precoder gives high data rate with high received signal power. Complexity of the diagonal precoder has been checked using digital signal processor starter kit -6713, a 32 bit floating point digital signal processor. Our results shows that there is improvement in received signal power by 20 dB while maintaining the same bit rate with low complexity of the system.

Keywords— VDSL (Very high speed digital subscriber line), Precoder, PSD (Power spectral density), DSL (Digital subscriber line).

I. INTRODUCTION

Digital subscriber line is a very old broadband communication technology, which use the potential of exiting twisted pair telephone line. It provide services such as high speed internet access, voice and multimedia communication over conventional telephone line which is already installed for residential and official use to home and in offices. In the present scenario when all the devices are going to connect through internet, there is requirement of high bandwidth. To full fill the requirement of high speed transmission, DSL technology shifted from Asymmetric digital subscriber line (ADSL), Very high speed digital subscriber line (VDSL), VDSL-2 to Fiber to the transmission point (FTTx) and Giga bit fast transmission (G –Fast) with the data rate up to 100 Mbps. VDSL-2 is advance form of VDSL and operate at frequency range of 30 Mhz. Advance version of xDSL is G-fast, which work at the frequency range of 100 Mhz. At higher frequencies, the problem due to electromagnetic coupling between twisted pair wire will also increase. One of the solution to minimize electromagnetic coupling is to decrease the length of wire from 1kilometer (as in ADSL) to 400 meters. Develop new crosstalk minimization algorithm for the improvement in data rate. Crosstalk is classified in two types, Near end crosstalk (NEXT) and Far end crosstalk (FEXT). Effect of crosstalk on wire pair is shown in Fig. 1.

In downstream transmission, crosstalk on the transmitter side can be cancelled using precoders. It is used to predistort the information bearing signal before passing through the channel. Precoders are broadly classified into two types, linear and nonlinear precoders. Linear precoders suffer due to additional transmit power requirement and high complexity of the system. Complexity of the system can be reduced with the help of high speed DSP processor like, DSK 6713 floating point processor [1]. Nonlinear precoders are used to compensate the problem of linear precoders, but it requires, additional change in modem on the customer side.

In this paper, we propose the Novel concept of symbol relocation in the constellation plane. It maximize the received signal power in the linear precoders while maintaining the same data rate. Data rate has been measured with, linear and nonlinear precoders for near far scenario of twisted pair channel.

The paper is organized as follows. Vectored transmission has been explained in Section II. Details of precoding algorithms for downstream transmission are given in section III. Simulation and results for bit rate performance and received signal power are given in section IV. Conclusion and future scope are summarized in section V and VI.
II. VECTORED TRANSMISSION

Precoding in downstream transmission and crosstalk canceller in upstream transmission, in combine is known as vectoring. Vectoring is an advance technique used for crosstalk cancellation in broadband communication using twisted pair wire. In downstream transmission, the crosstalk due to electromagnetic coupling can be minimized by precoders. The purpose of precoder is to pre-distort the information bearing signal according to the variation of channel. Pre-distorted signal on the transmitter side can cancel the crosstalk effect on the received side. There are many type of precoders which are used in vectored DSL. The precoders are broadly classified as linear precoder and nonlinear precoder. Zero forcing and Diagonalization precoders are linear precoder and Thomlinson Harashima (TH) is one of example of non linear precoder, SVD (Singular value decomposition) is used for crosstalk minimization in both downstream and upstream transmission. Fig. 2 gives detail about DSL access multiplexing (DSLAM) block, which is responsible for pre-compensation and post compensation in downstream and upstream transmission respectively. Precoders shift the position of information bearing signal based on reverse of the distortion in channel characteristics, it is known as pre-compensation signal. When pre-compensated signal pass through channel, distortion due to crosstalk present in the channel get the pre-compensated signal back to its original position.

Fig. 2. Vectoring operation on transmitted signal [ref-11]

System Model

In DSL network, there are set of users defined as, \( \mathcal{N} = \{1, \ldots, N \} \) working on different frequency tones \( \mathcal{K} = \{1, \ldots, K \} \). The response of the system model at each frequency tone \( k \) is given in equation (1),

\[
Y_k = H_k X_k + Z_k
\]

(1)

Vector \( X_k \triangleq [x_k^1, \ldots, x_k^n]^T \) denotes a transmitted signal of all users at frequency tone \( k \). Here \( x_k^1 \) is the transmitted signal of the first user at frequency tone \( k \). Similarly, \( Y_k \triangleq [y_k^1, \ldots, y_k^n]^T \) and \( Z_k \triangleq [z_k^1, \ldots, z_k^n]^T \) are the received signal vector and Adaptive white Gaussian noise (AWGN) noise vector respectively for all users at frequency tone \( k \). Channel characteristic \( H_k \) is defined as \( N \times N \) matrix of twisted pair wire. In this model the transmitted signal is same as information bearing signal. Bit rate for different users at particular frequency \( k \) is based on the received signal power and noise content at that particular frequency \( k \). Total noise at the receiver side is some of the AWGN noise and the crosstalk between twisted pair wire. Bit rate for particular user \( n \) at frequency \( k \) without precoding is given in equation (2),

\[
b_k^n = \log_2 \left( 1 + \frac{\|x_k^n\|^2}{\sigma_k^n + \Delta_f \sum_{m \neq n} \|h_k^{(n,m)}\|^2} \right)
\]

(2)

with reference to equation (2), power spectral density of the transmitted signal is defined as, \( S_k^n \triangleq \{ \|x_k^n\|^2 \}/\Delta_f \)

Where \( \{ \} \) is the expected operator and \( \Delta_f \) is frequency tone spacing in particular modem. Noise power spectral density \( \sigma_k^n \triangleq \{ \|z_k^n\|^2 \}/\Delta_f \) is defined for user \( n \) on frequency tone \( k \). Symbol is function of coding gain and noise margin.

III. PRECODING ALGORITHMS

Precoders are used for crosstalk cancellation in downstream transmission. It is used to pre-distort the information bearing signal, based on prior information about channel characteristics. Block diagram of Transmitted signals are shown in Fig. 3.
Precoders are divided into two categories, linear and nonlinear. Precoder can improve the performance in terms of data rate for downstream transmission. Bit rate calculation using linear and nonlinear precoding algorithms for downstream transmission are given below in detail.

1) Zero Forcing Precoder: Zero forcing precoder, works on basic precoding algorithm, it use inverse of the channel characteristics for precoding. Information bearing signals are pre-distorted using inverse of the channel characteristics. If $X_k$ is information bearing signal and $H_k^{-1}$ is the inverse of the channel characteristics, then the transmitted signal $\hat{X}_k$ of zero forcing precoder is define as, $X_k = H_k^{-1}\hat{X}_k$. The output response of zero forcing precoder is given in equation (3),

$$Y_k = H_k(H_k^{-1}\hat{X}_k) + Z_k$$

Equation (3), can further simplify to get output signal on the receiver side is, $Y_k = H_kX_k + Z_k$. Pre distortion of the information signal with inverse of the channel characteristics, cause increase in the power of the transmitted signal above the spectral mask constraint. The increase in access transmit power can be minimized by use of scaling factor. The precoded signal can be multiplied by the scaling factor before transmission through the channel. Many algorithms have been proposed in the past for the calculation of scaling factor. Reference [2], the scaling factor has been calculated based on

$$\beta_k^n = \sum_{m,n} \left| (H_k^{-1})_{(n,m)} \right|^2$$

As in [2], the scaling factor was same for all the users and considered as the maximum among all the values, $\beta_k \equiv \max \beta_k^n$. The out-put of the received signal is scaled by constant value and the received signal is given in equation (4),

$$Y_k = \frac{\hat{X}_k}{\beta_k} + Z_k$$

2) Diagonalization Precoder: This precoder is very much similar to Zero forcing precoder, except the concept of scaling factor. In [2], further modification in the scaling factor has been done to improve the bit rate of individual users, now the scaling factor is different for individual users. The scaling factor for diagonal precoder is as follows,

$$\beta_k^{\text{diag}} = \max \sum_{m\in\mathbb{N}} (H_k^{-1})_{(n,m)} h_k^{(m,m)}$$

The output signal of diagonalization precoder (DP) is given as,

$$Y_k = \frac{\text{diag}(H_k)\hat{X}_k}{\beta_k^{\text{diag}}} + Z_k$$

The bit rate of individual user for (DP) can be calculated as,

$$b_k^n = \log_2 \left( 1 + \frac{\left| h_k^{(n,n)} \right|^2 s_k^n}{\sigma_k^2 + \left( \beta_k^{\text{diag}} \right)^2} \right)$$

3) Expanded Constellation Precoder: The Authors of this paper, have proposed the new algorithm for further minimization of transmitted signal power and to improve the received power gain. This algorithm works on the principle of expanded constellation mapping [3], the transmitted symbol on each tone has to be re-mapped with the best possible symbol among the expanded constellation set. The best possible symbol can be found by optimization.

The new collection of expanded constellation set for $k^{th}$ symbol is, $\mathcal{A}_k = \{A_k^{(x)}\}_{x=1}^{K}$ and $(rk)$ is the range of expanded symbols. The best possible symbol for individual user can be calculated using optimization is given in equation (6),

$$\hat{s} = \arg \min ||H^{-1}Ds||^2 \quad s \in \mathcal{A}_k$$
\( D = \text{diag}(H) \), is the diagonal elements of the channel matrix. For the best possible value of \( \hat{s} \) refer to equation (6), the minimum value of scaling factor is defined as,
\[
\beta = \mathbb{E} s \left[ \| H^{-1} D s \|^2 \right]
\]
Transmitted signal based on expanded constellation precoder is defined as,
\[
x = \left( \frac{1}{\beta_{\text{min}}} \right) H^{-1} \ast D \ast \hat{s}
\]
The output of Expanded constellation precoder is defined as,
\[
\hat{y} = \left( \frac{1}{\beta_{\text{min}}} \right) D \ast \hat{s} + n
\]

4) Thomlinson Harashima Precoder: Thomlinson Harashima precoder is a type of non-linear precoder, which recursively cancel the far end crosstalk. The operation of crosstalk cancellation is defined in two steps. In very first step, the intermediate signal is written in the form of non-linear difference equation and later use of modulo operation. Due to this non linearity, the signal power of the transmitted signal will increase to some extent. The purpose of this modulo operator is to fix some bound to avoid access energy in the intermediated symbols [4]. The structure of Thomlinson Harashima precoder is shown in Fig. 4,

\[
\begin{align*}
\hat{x} & \xrightarrow{\gamma_a} x \xrightarrow{\mathcal{Q}} X \xrightarrow{\text{Channel}} X' \xrightarrow{\gamma} \hat{y} + n
\end{align*}
\]

Fig.4. Thomlinson Harashima precoder [ref-10]

In this algorithm, channel matrix \( H_k \) decompose in the form of unitary matrix \( Q_k \) and upper triangular matrix as, \( H_k^* = Q_k \ast R_k \), the symbol \( H_k^* \) is the conjugate of the (channel matrix) \( H_k \). The information bearing signal \( \hat{X}_k \) is converted into intermediate transmitted signal \( (X_k)^{\text{int}} \), which is later passed through by unitary matrix\( Q_k \). The unitary matrix is used to rotate the signal space, so there is no further improvement in signal energy. The received signal after Precoding is given as which further simplifies as,
\[
Y_k = (R_k)^\dagger (X_k)^{\text{int}} + Z_k
\]

For crosstalk free reception in Thomlinson Harashima (TH) precoder is defined as,
\[
Y_k = H_k(Q_k(X_k)^{\text{int}}) + Z_k
\]

For crosstalk free reception in Thomlinson Harashima (TH) precoder is defined as,
\[
S\hat{X}_k = (R_k)^\dagger (X_k)^{\text{int}}
\]

The symbol \( S \), is the diagonal values of upper triangular matrix, equation (7), can further simplifies in terms of matrix as shown in equation (8),
\[
\begin{pmatrix}
\hat{x}_k^1 \hspace{1cm} 0 \hspace{1cm} 0 \\
0 \hspace{1cm} \ddots \hspace{1cm} 0 \\
0 \hspace{1cm} 0 \hspace{1cm} \hat{x}_k^{N,N}
\end{pmatrix}
\begin{pmatrix}
\hat{x}_k^1 \\
\vdots \\
\hat{x}_k^N
\end{pmatrix}
= \begin{pmatrix}
\hat{x}_k^{1,1} \hspace{1cm} 0 \hspace{1cm} \ldots \hspace{1cm} 0 \\
0 \hspace{1cm} \hat{x}_k^{2,2} \hspace{1cm} \ldots \hspace{1cm} 0 \\
\vdots \hspace{1cm} \vdots \hspace{1cm} \ddots \hspace{1cm} \vdots \\
0 \hspace{1cm} 0 \hspace{1cm} \ldots \hspace{1cm} \hat{x}_k^{N,N}
\end{pmatrix}
\begin{pmatrix}
(x_k^{1,1})^{\text{int}} \\
\vdots \\
(x_k^{N,N})^{\text{int}}
\end{pmatrix}
\]

Equation (8), can further simplified in terms of difference equation (9),
\[
\begin{align*}
(x_k^{1,1})^{\text{int}} &= \hat{x}_k^1 \\
(x_k^{2,2})^{\text{int}} &= \hat{x}_k^2 - \frac{r_{21}}{r_{22}} (x_k^1) \\
(x_k^{N,N})^{\text{int}} &= \hat{x}_k^N - \ldots - \frac{r_{N1}}{r_{NN}} (x_k^1)
\end{align*}
\]

During this operation, there is increase in energy of the intermediated transmitted signal\( (X_k)^{\text{int}} \). The access energy can be minimized using modulo operation on the transmitter side. Mathematically modulo operation is defined as, \( \text{mod}_M[a] \triangleq a - \frac{a}{M} M \). The intermediated transmitted symbol of TH precoder using modulo operation is given in equation (10),

\[
\text{mod}_M[a] = a - \frac{a}{M} M
\]
\[(x_k^n)^{int} = \text{mod} \ z_k^n, \text{mask} \left[ \hat{x}_k^n - \sum_{m=1}^{n-1} \frac{r_k^{m,n}}{r_k^{m,m}} (x_k^n)^{int} \right] \] (10)

The bit rate for an individual user using Thomlinson Harashima precoder are given in equation (11),

\[b_k^n = \log_2 \left( 1 + \frac{\left| \gamma^{(n,n)}_k \right|^2}{\sigma_k^2} \right) \] (11)

5) Singular value decomposition Precoder: Singular Value Decomposition are basically used, when transmitter and receiver are co-located. SVD use precoding for downstream transmission and crosstalk cancellation in upstream transmission. In this algorithm, channel matrix \(H_k\) decompose in three sub matrix.

\[H_k = U_k \Lambda_k V_k^T \] (12)

\(U_k\) and \(V_k\) are unitary matrix which are orthogonal to each other. Precoding matrix \(V_k\) work at transmitter and \(U_k^T\) work as equalizer at the receiver. Matrix \(\Lambda_k\), can work as virtual channel. The received signal at receiver is define as \(\tilde{Y}_k\). The received signal at the receiver is achieved after the modification of actual signal with \(U_k^T\) is \(\tilde{Y}_k = U_k^T Y_k\), which can be simplified further in equation (13)

\[\tilde{Y}_k = U_k^T [H_k X_k + Z_k] \] (13)

Equation (13), can further simplifies as,

\[\hat{Y}_k = \Lambda_k \hat{X}_k + U_k^T Z_k \]

The bit rate of the SVD precoder is calculated as,

\[b_k^n = \log_2 \left( 1 + \frac{\left| \gamma^{(n,n)}_k \right|^2}{\sigma_k^2} \right) \] (14)

IV. SIMULATION AND RESULT

In this section, we evaluate the performance of received signal power for diagonalization precoder using expanded signal constellation method. Bit rate has been calculated using linear and nonlinear precoder for VDSL-2. The VDSL-2 is the extended form of VDSL and works on the frequency range of 30 Mhz. Per line transmit power for simulation are considered as 4dB. The AWGN noise are considered for simulation with noise PSD of -140 dBm/Hz and coding gain is considered as 12 dB. Complete operating bandwidth of VSDL-2, is divided in different sub carrier and frequency tone spacing between subcarrier is 4.3125 Khz. Spectral mask constraints are considered from [5] [6]. Four cables in a binder are used for modeling of MIMO channel matrix [7]. Each cable is made of twisted pair wire of diameter 24 gauge and considered as cable of unequal length (0.5, 1.0, 1.5, 2.0 kfeet). The channel characteristics are define as,

\[H_{dL} = e^{-(dy)} \] (15)

Channel gain \((H)\), is proportional to propagation constant \(\gamma\) and length of wire \((d)\). Propagation constant in equation (15), is define in terms of R (resistive), L (inductive), C (capacitive), G(conductive) parameters.

\[\gamma = \sqrt{(R + jwL)(G + jwC)} \]

For downstream communication at Mhz frequency range, channel characteristics behave as, row wise diagonal dominated (RWDD). In RWDD channel, the value of direct channel coefficient in a matrix is higher than the off diagonal value in a channel, due to crosstalk coupling between a pair of wires. The crosstalk coupling in each wire pair is taken from [8] to simulate complete Multiple input multiple output (MIMO) channel matrix. QAM is used as modulation technique for the transmission of signal. Simulation parameters are given below in Table-1.

<table>
<thead>
<tr>
<th>Parameter</th>
<th>Value</th>
</tr>
</thead>
<tbody>
<tr>
<td>Wire type</td>
<td>24 gauge twisted pair</td>
</tr>
<tr>
<td>Carrier spacing</td>
<td>4.3125 kHz</td>
</tr>
<tr>
<td>Band plan</td>
<td>30 Mhz</td>
</tr>
<tr>
<td>Capacity gap</td>
<td>12 dB</td>
</tr>
<tr>
<td>Noised PSD</td>
<td>-140dBm/Hz</td>
</tr>
<tr>
<td>Signal power</td>
<td>4 dB</td>
</tr>
<tr>
<td>Crosstalk coupling</td>
<td>12.5dB</td>
</tr>
<tr>
<td>Length of wire</td>
<td>(0.5, 1.0, 1.5, 2.0) kfeet</td>
</tr>
</tbody>
</table>
Expanded constellation mapping, is symbol optimization technique used for the improvement of received power gain in dB. Received power gain in the expanded constellation mapping has been improved by the minimization of scaling factor $\beta$. Comparative result of received power gain, with expanded constellation mapping and without symbol mapping is shown in Fig. 5, for the 400 tones. There is variation in received power gain due to different scaling factor. We can easily make-out the improvement in the received power in dB by using expanded constellation mapping.

![Fig. 5. Received power gain analysis of DP precoder](image)

The performance of modulo operation used in TH precoder are shown in Fig. 6. It shows the shift of symbol away from the original symbol position. As the distance of symbol move away from origin increase, there is increase in the symbol energy. Modulo operation are used after precoding to bound the symbol energy in the limited range.

![Fig. 6. Modulo operation in TH precoder](image)

At the receiver, the symbol has to get back to the optimum symbol position. Fig. 7, gives the clear idea about the optimum position of received symbol before detection. To recover the original symbol on the receiver side, one more modulo operation has to be used at the receiver. Requirement of additional module on the receiver and transmitter side is one of the big drawback for Thomlinson Harashima precoder. This precoder does not require additional power for the transmission of information bearing signal or pre-coded signal.

![Fig. 7. Received symbol using TH precoder](image)
In SVD precoder, the precoding matrix $P$, is used on the transmitter side. There are increase in symbol energy due to precoding, which can be minimized by equalizer matrix used on the receiver side. The original symbols, precoded and recovered symbols can be seen in the Fig. 8. In the below Fig, there are increase in symbol energy for the precoded symbol due to shift in symbol position away from origin. Energy are measured as the distance of the symbol from origin. At the receiver side, due to the presence of matrix $(U)$, the received signals are coming back to their original symbol position which can be detected after optimization.

![Fig. 8. Precoded and recovered symbol in SVD precoder](image)

Bit rate performance of four users of different length has been shown in Fig. 9. Diagonalization precoding, TH and SVD precoding algorithms has been used for data rate calculation from the same information bearing symbol. Simulation of the code is done on Matlab 2015. Result shows that there is good improvement in the data rate with the use of precoders in downstream transmission for VDSL-2. Comparative data rate for all three precoders are also plotted. Among the three precoders, the performance of SVD precoder are better than the Diagonal precoder and Thomlinson Harashima precoder. The rate reach profile are plotted between data rates (Mbps) and length of the wires (kfeet). Bit rate of individual users are given in Table-2.

![Fig. 9. Rate reach profile using different precoders for VDSL-2](image)

**TABLE II BIT RATE for USER with DIFFERENT PRECODING ALGORITHMS**

<table>
<thead>
<tr>
<th>Precoding technique</th>
<th>Bit rate (bps)</th>
<th>Bit rate (bps)</th>
<th>Bit rate (bps)</th>
<th>Bit rate (bps)</th>
</tr>
</thead>
<tbody>
<tr>
<td>SVD precoder</td>
<td>$2.7421 \times 10^8$</td>
<td>$1.284 \times 10^8$</td>
<td>$0.5859 \times 10^8$</td>
<td>$0.3354 \times 10^8$</td>
</tr>
<tr>
<td>DP precoder</td>
<td>$1.5500 \times 10^8$</td>
<td>$0.5005 \times 10^8$</td>
<td>$0.2279 \times 10^8$</td>
<td>$0.130 \times 10^8$</td>
</tr>
<tr>
<td>TH precoder</td>
<td>$5.6610 \times 10^7$</td>
<td>$2.5695 \times 10^7$</td>
<td>$1.4652 \times 10^7$</td>
<td>$0.9409 \times 10^7$</td>
</tr>
<tr>
<td>No precoder</td>
<td>$3.8751 \times 10^4$</td>
<td>$1.2512 \times 10^4$</td>
<td>$0.5697 \times 10^4$</td>
<td>$0.3254 \times 10^4$</td>
</tr>
</tbody>
</table>
V. CONCLUSION

Different precoding algorithm for the bit rate improvement has come, but they all were having constraints with respect to complexity of the system and power cut off. The novel precoding algorithm can minimize the complexity as well as, it will improve the received power gain in dB. The performance of diagonal precoder, has been improved with all three aspects. From the above result authors can conclude that, the diagonal precoder gives the appropriate result without any modification on the customer equipment. Thomlinson Harashima and Singular value Decomposition precoder need small modification on the customer equipment.

VI. CHALLENGES and OPPORTUNITY

Vectoring is one of the latest technology for the crosstalk cancellation in VDSL-2 and G-fast. The characteristic of channel matrix vary with the operating frequency range. There is a need of innovative crosstalk cancelation technique which can work at 200 Mhz frequency range. Further performance of the system can be improved for 30 Mhz frequency range using some modification in old precoding algorithms. In Thomlinson Harashima precoder the order of wire in a binder can also affect the data rate. We can use innovative search algorithm to provide high data rate for the high end user or enable vectoring for particular line that get maximum benefit. Vectoring technique can be used for non-vectored line with the help of pilot sequence. Development of new adaptive algorithm which can reduce the power from non-vectored line and can improve the rates for vectored line. There is a need of a new algorithm which can disabled particular frequency tone which is highly affected by radio frequency or time varying interference.

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