

5.4 Implementing Whitening Decision Feedback

- The use of Cholesky factorization does not sound promising, but it's reasonably straightforward.
- Brute force application of Cholesky to a block of N symbols requires about $N^3 K^3$ operations [Proa 95].
- The block tridiagonal nature of $C^T R C$ can be exploited to reduce computation.

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 \end{bmatrix}
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 \end{bmatrix}^T
 \begin{bmatrix}
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 & & & & & \times & \times
 \end{bmatrix}$$

$C^T R C = F^T F$

- [Wei 96] shows how the blocks of F can be computed recursively, in a series of $K \times K$ smaller Cholesky decompositions.
 Effort proportional to $N K^3$ — a major reduction!
 Per detected bit (NK of them), it's proportional to K^2 — so K^2 times the effort of the conventional single-user detector
- [Alex 98] provides a more understandable proof that the recursion converges.

- The formalism of Cholesky decomposition can be started if we use Gauss elimination (Appendix 0) instead. For some $H = C^T R C$, factor by:

$$\textcircled{1} \left[\begin{array}{cccc|cc} H_{11} & H_{12} & \dots & H_{1,k-1} & H_{1k} & 1 & 0 & \dots & 0 & 0 \\ H_{21} & H_{22} & \dots & H_{2,k-1} & H_{2k} & 0 & 1 & & & \\ \vdots & \vdots & & \vdots & \vdots & \vdots & \vdots & & \vdots & \vdots \\ H_{k-1,1} & H_{k-1,2} & \dots & H_{k-1,k-1} & H_{k-1,k} & 0 & 0 & \dots & 1 & 0 \\ H_{k1} & H_{k2} & & H_{k,k-1} & H_{kk} & 0 & 0 & \dots & 0 & 1 \end{array} \right]$$

- $\textcircled{2}$ Clear out last col of H by subtracting from row i a multiple $H_{i,k}/H_{kk}$ times last row:

$$\left[\begin{array}{cccc|cc} X & X & & X & 0 & 1 & 0 & -H_{1k}/H_{kk} \\ X & X & & X & 0 & 0 & 1 & -H_{2k}/H_{kk} \\ & & & & 0 & 0 & 0 & \\ & & & & 0 & 0 & 0 & \\ X & X & & X & 0 & 0 & 0 & -H_{k-1,k}/H_{kk} \\ H_{k1} & H_{k2} & \dots & H_{k,k-1} & H_{kk} & 0 & 0 & H_{kk} \end{array} \right]$$

- $\textcircled{3}$ Clear out other columns of left side similarly until

$$\left[\begin{array}{c|c} \text{shaded } \triangle & \text{shaded } \triangle \\ \hline & 0 \end{array} \right]$$

$L \quad U$

(see interactive demo)

so

$$UH = L \quad H = U^{-1}L = \nabla \cdot \nabla$$

This is just a disguised form of Cholesky, so computation is the same. Decisions and BER are identical.

- To use it, form

$$\underline{z} = U \underline{y} = U C^T R C A \underline{b} + U \underline{q}$$

$$= L A \underline{b} + \underline{\alpha}$$

where components of $\underline{\alpha}$ are uncorrelated:

$$R_{\alpha} = N_0 U C^T R C U^T = N_0 L U^T$$

and $L U^T$ is diagonal, since Hermitian and triangular.

so we can do DF, starting with $b_1(0)$.

→ In fact, we don't have to form U and multiply \underline{y} by it. We solve

$$C^T R C A \underline{b} = \underline{z}$$

so just reduce $C^T R C A | \underline{z}$ to lower triangular and back substitute the decisions \hat{b}_i .

- Computation for a block of N symbols is proportional to $N^3 K^3$ if done without thought. Again, block tridiagonal helps:

$$\left[\begin{array}{cccc|cccc} x & & & & I & & & \\ x & x & x & & & I & & \\ & x & x & x & & & I & \\ & & x & x & x & & & I \\ & & & x & x & x & & \\ & & & & x & x & & \\ & & & & & x & x & \\ & & & & & & & I \end{array} \right]$$

Computation proportional to $N K^3$; proportional to K^2 per detected bit.

- Accommodates long codes and time varying C .

- For continuous operation, N unbounded, we would allow a window P symbols into the future and $2K$ into the past (for DF). In this respect, it resembles DFE, with linear forward section.
 - If short codes, static channels, then the pattern of such a receiver is fixed (and cyclic over K symbols).
 - If long codes, the coeffs appear to need recalculation at every symbol.
 - If short codes, slowly varying channels, is there a way to update, instead of recalculate, the coefficients?
- In asynchronous operation, there is no "last user" of the K , the one that enjoys single user performance with (ideally) no MAI, since more MAI from future rolls in. Ranking by power loses meaning; does error propagation kill the idea?
 - Since all users are first users, we could adopt mmse, instead of ZF, from the future. Then it's a cyclic form of DFE.