

# Interference Avoidance in Wireless Systems

Christopher Rose

WINLAB

the **W**ireless **I**nformation **N**etworks **L**ABoratory

at Rutgers University

Dept of Electrical and Computer Engineering

<http://www.winlab.rutgers.edu/~crose>

DIMACS, October 8, 2002

## What Is Interference Avoidance?

- Each transmitter knows its channel (or average)
- Receiver broadcasts covariance
- Users greedily adjust modulation
- Receiver tracks codeword changes
- (Amazingly) everything settles down to an optimum

- Interference avoidance can be used on:
  - fading/dispersive channels
  - asynchronous systems
  - multiuser MIMO systems
- REALLY want multiple mutually interfering transceivers
  - Not quite there yet
  - Might need interference-tropic (seeking) methods

**Where Are We Now?**

## Brass Tacks: Vector Channel Model

$$\mathbf{r} = \sum_{\ell=1}^L \mathbf{H}_{\ell} \mathbf{x}_{\ell} + \mathbf{n}$$

- User  $\ell$  input vector  $\mathbf{x}_{\ell}$ : dimension  $N_{\ell}$
- Channel matrix  $\mathbf{H}_{\ell}$ :  $N \times N_{\ell}$  ( $N \geq N_{\ell}$ )
- Received vector  $\mathbf{r}$ : dimension  $N$
- Additive noise  $\mathbf{n}$ : dimension  $N$

## Multicode CDMA

- Each  $\mathbf{x}$  is a superposition of independent information streams:

$$\mathbf{x} = \mathbf{S}\mathbf{b}$$

- where

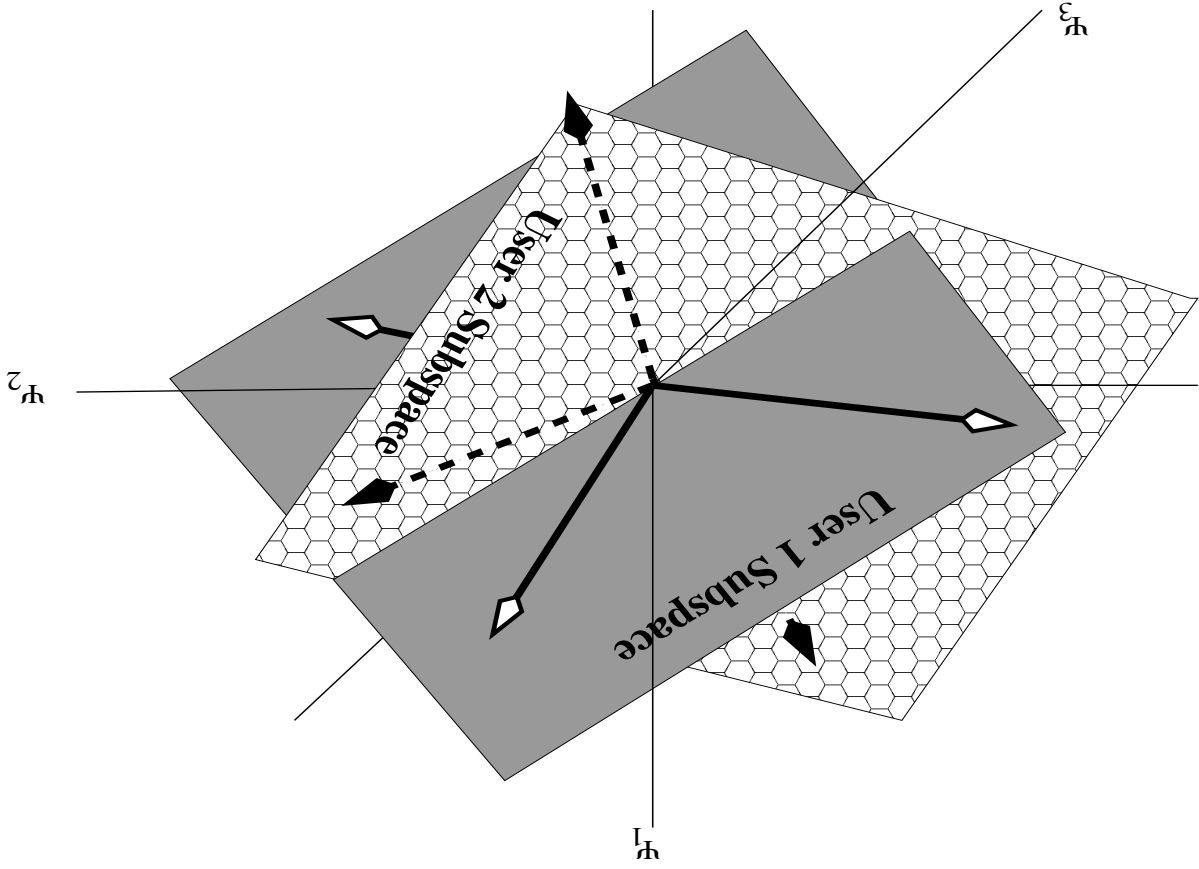
$$\mathbf{S} = \begin{bmatrix} | & | & | & | \\ \mathbf{s}_1 & \mathbf{s}_2 & \dots & \mathbf{s}_B \\ | & | & | & | \end{bmatrix}$$

- and

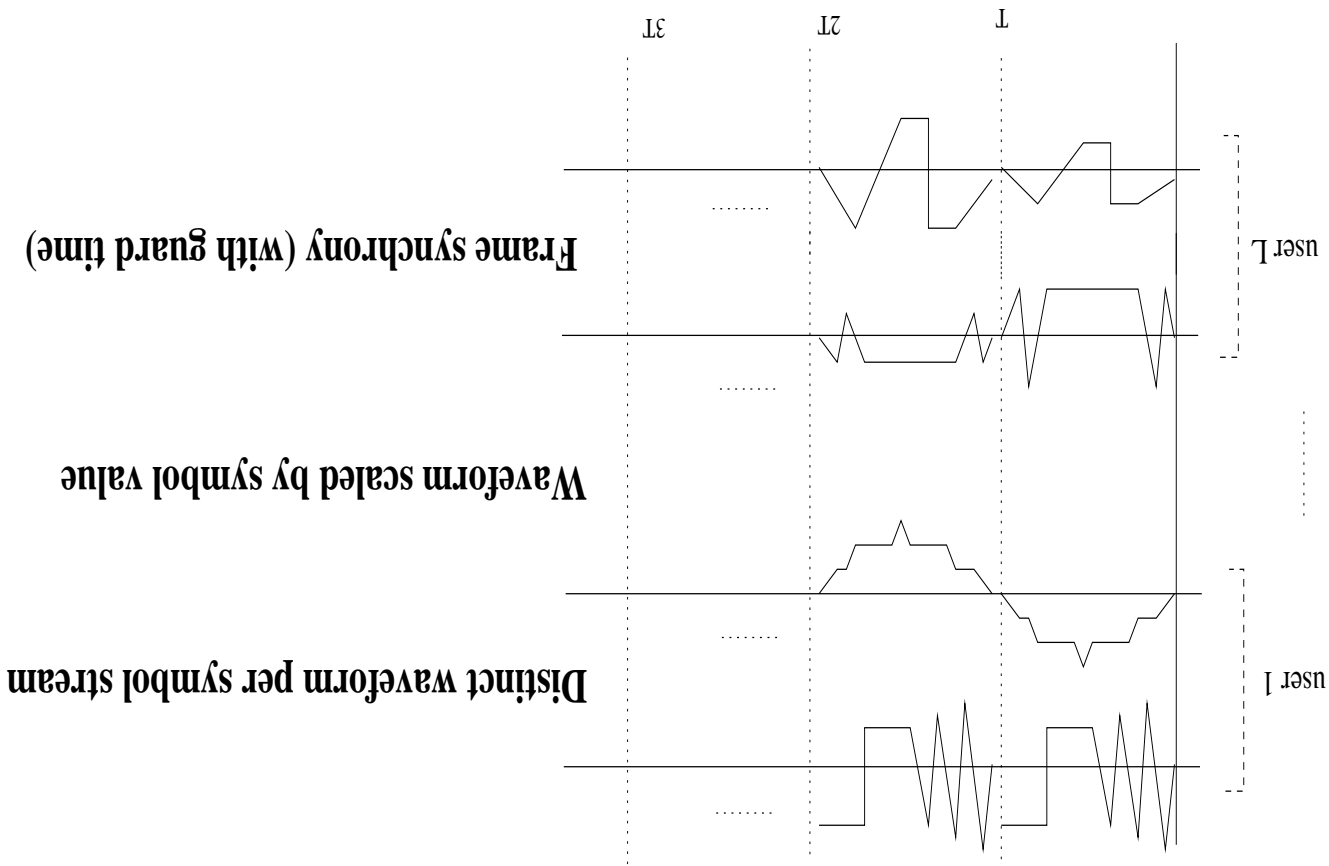
$$\mathbf{b}^\top = \begin{bmatrix} b_1 & \dots & b_B \end{bmatrix}$$

- $B$ : number of codewords used

# Multicode Pictorial Representation



# Yet Another Multicode Picture



## Our General approach to MAC

- different users in different signal spaces
- different dimensions and potential overlap
- all subspaces of the receiver signal space
- use multicode CDMA

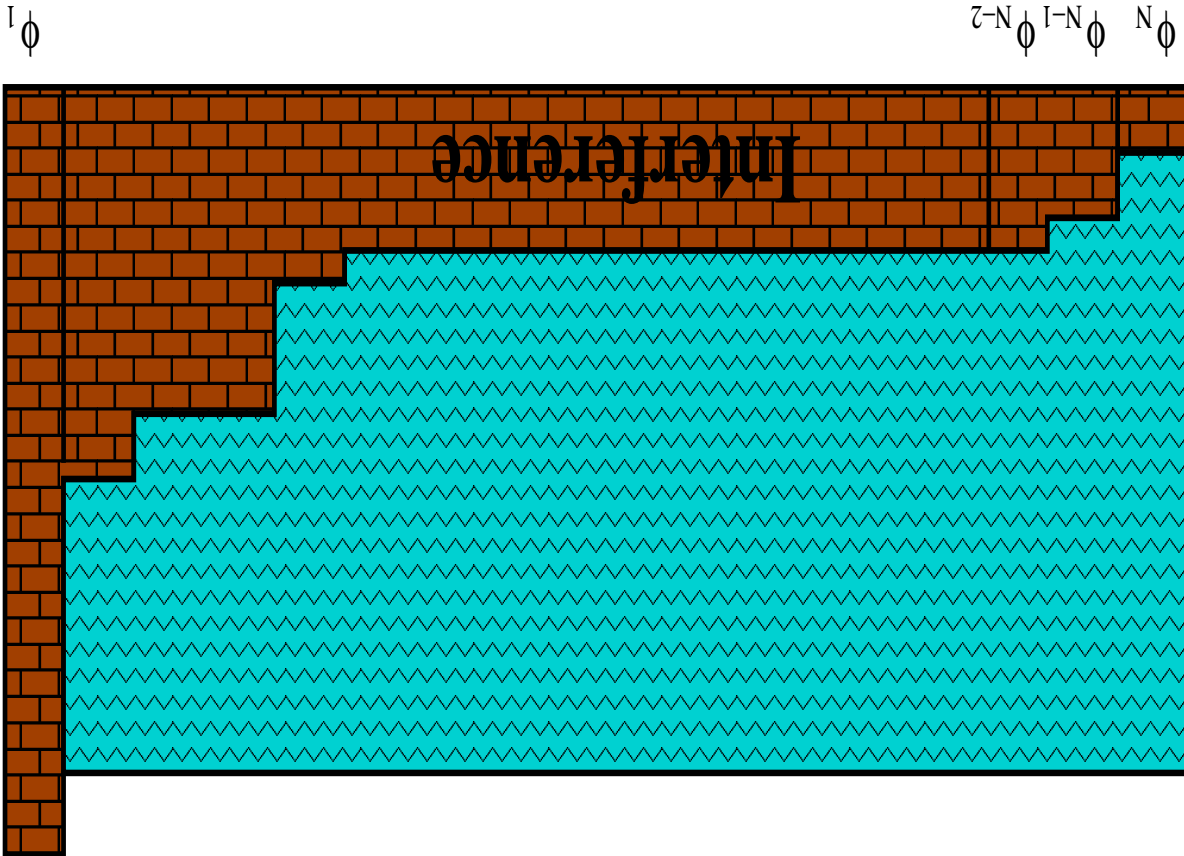


- Done from the perspective of each infostream (each codeword  $s_{ij}$ )
- A variety of replacement procedures and codeword orderings
- Guaranteed to converge *in class*
- A given user's codewords share the same SINR
- Optimal convergence proofs have been bears
- Empirically always converges to optimum

## Interference Avoidance

## IA Iteration Possibilities

- MMSE: use MMSE filter coeffs as codeword (Uluksus & Yates)
- GREEDY: highest SINR codeword (and corresponding filter at receiver)
- LAGGED: use linear combo of current and greedy target
- RANDOM: do any other CW which increases your SINR.



**EMERGENT Waterfilling**

## Whitening Approach Details

- Whitening:

$$\mathbf{Q}^k \mathbf{R} \mathbf{Q}^k{}^\top = \mathbf{S}^k \mathbf{S}^k{}^\top + \mathbf{Q}^k \left[ \sum_{\ell \neq k} \mathbf{H}^\ell \mathbf{S}^\ell \mathbf{S}^{\ell\top} \mathbf{H}^{\ell\top} + \mathbf{W} \right] \mathbf{Q}^k{}^\top$$

- set

$$\mathbf{x} \left[ \mathbf{Q}^k{}^\top \left[ \mathbf{W} + \sum_{\ell \neq k} \mathbf{H}^\ell \mathbf{S}^\ell \mathbf{S}^{\ell\top} \mathbf{H}^{\ell\top} + \mathbf{Q}^k \left[ \mathbf{S}^k \mathbf{S}^k{}^\top - \mathbf{s}_{kj} \mathbf{s}_{kj}{}^\top + \mathbf{Q}^k \right] \right] \right] \arg \min_{|\mathbf{x}|=1} \mathbf{x}^\top$$

## SINR Improvement Approach Details

- set

where

$$\mathbf{R}_k = \left[ \sum_{\ell} \mathbf{H}_\ell \mathbf{S}_\ell \mathbf{S}_\ell^\top \mathbf{H}_\ell^\top + \mathbf{W} - \mathbf{H}_k s_{kj} s_{kj}^\top \mathbf{H}_k^\top \right]$$

$$s_{kj} = \arg \max_{|\mathbf{x}|=1} \mathbf{H}_k^\top \mathbf{R}_k^{-1} \mathbf{H}_k \mathbf{x}$$

## Sum Capacity and IA

- Sum Capacity:
 
$$C = \frac{1}{2} \log \det \left( \sum_{\ell=1}^L \mathbf{H}_\ell \mathbf{S}_\ell \mathbf{H}_\ell^\top + \mathbf{W} \right) - \frac{1}{2} \log(\det \mathbf{W})$$
- Simultaneous waterfilling  $\rightarrow$  maximum sum capacity
  - assuming each user has enough codewords to waterfill
  - IA (optimal) fixed point is mutual waterfilling

## IA: not necessarily iterative waterfilling

- Iteratively replace each user's codewords until convergence
  - Iterative waterfilling  $\rightarrow$  maximum sum capacity [Yu, et al, 2001]
- Randomly replace codewords until convergence
  - Simultaneously waterfilled ensembles  $\rightarrow$  maximum sum capacity
  - Too few codewords (true waterfilling impossible) still converges
    - Sum capacity max'ed? (not known, suspect yes)

## IA and OFDM Channel Models

- Use tones as basis
- Obviously complex representations possible, but ...
  - Single-sided: trouble with too few dimensions (not enough eigenvalues)
  - Double-sided: unrealizable codewords
- Could adapt with some redefinitions and algebraic play
- We use real representations for “notational simplicity”



- Interference + Multiaccess Channels = maximum sum capacity
  - Iterate per user (iterative waterfilling)
  - Iterate other ways (emergent waterfilling)
- Iteratively increases sum cap when true waterfilling impossible
  - Can apply IA to any vector channel problem:
    - general dispersive channels,
    - multiuser MIMO
    - asynchronous systems, etc.
- Future: independent mutually interfering systems – interference channel

**Conclusions**