

# Precoding Design and Performance Bounds for Integer-Forcing MIMO Communication

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# Introduction

- The Single-User Multiple-Input Multiple-Output (MIMO) Gaussian channel has been the focus of extensive research

$$\mathbf{y}_c = \mathbf{H}_c \mathbf{x}_c + \mathbf{z}_c,$$

- $\mathbf{x}_c \in \mathbb{C}^{N_t}$  is the channel input vector
- $\mathbf{y}_c \in \mathbb{C}^{N_r}$  is the channel output vector
- $\mathbf{H}_c$  is an  $N_r \times N_t$  complex channel matrix  
→ Fixed over entire block length
- $\mathbf{z}_c \sim \mathcal{CSCN}(0, \mathbf{I})$
- Power constraint:  $\mathbb{E}(\mathbf{x}_c^H \mathbf{x}_c) \leq N_t \cdot \text{SNR}$

# Introduction

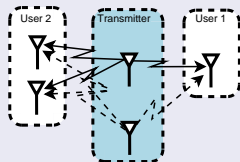
- The MIMO Gaussian broadcast channel has also been widely studied for well over a decade now:

$$\mathbf{y}_c^i = \mathbf{H}_c^i \mathbf{x}_c + \mathbf{z}_c^i$$

- Private (only) Messages vs. Common (only) Messages
  - Capacity is known for both scenarios ✓
  - Practical schemes?
    - Private Message ✓ (DPC: Tomlinson...)
    - Common Message?
      - ⇒ Single user: SVD or QR+SIC
      - ⇒ Two users: Solved using joint triangularization (Khina '12)
      - ⇒ Moderate # of users: Extensions exist, not optimal (Khina '12)
      - ⇒ Infinite # of users (knowing only WI-MI): Approximate joint triangularization is not very good ⇒ **Topic of this talk**

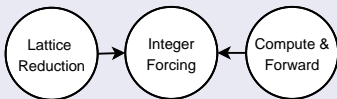
# Objective

- Can we find a scheme that is:
  - Practical
    - Linear complexity in the block length
    - Uses off-the-shelf SISO codes
  - Has provable good performance guarantees
  - Universal: Is good for all channels with same WI-MI (compound channel setting), i.e.,  $\mathbf{H}_c \in \mathbb{H}(C_{WI})$
- Universal  $\implies$  needs to deal with DoF mismatch

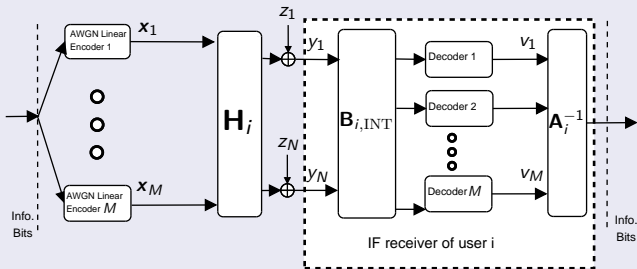


# Candidate Scheme for OL-MIMO Broadcast: Integer Forcing

- Equalization scheme introduced by Zhan '10, et. al.



- Idea: Decode linear combination of messages  $\implies$  Invert



# Integer-Forcing Equalization: Basic Idea

- Consider the (SU) channel

$$\mathbf{H} = \begin{bmatrix} 2 & 1 \\ 1 & 1 \end{bmatrix}$$

- At high SNR linear receiver front-end *inverts* the channel (ZF) thus resulting in *noise amplification*

$$\mathbf{H}^{-1} = \begin{bmatrix} 1 & -1 \\ -1 & 2 \end{bmatrix} \implies \sigma_1^2 = 2, \sigma_2^2 = 5$$

- Can we avoid noise amplification?
- IF idea: If all streams are coded with **same** linear code  $\implies$   
 $\text{Integer} \times \text{Codeword} + \text{Integer} \times \text{Codeword} = \text{Codeword}$
- However, normal channels do not consist only of integers
- Integer Forcing (IF) equalization equalize the channel to be “nearest” integers-only matrix

# Candidate Scheme for OL-MIMO Broadcast: Integer Forcing

- What is already known?
- Ordentlich '15, et. al.:
  - For single-user Open-Loop:
    - Rx side - Integer Forcing Equalization
    - Tx side - Space-Time Linear Precoding
  - 😊 A linear Non-Vanishing Determinant (NVD) precoder achieves the mutual information up to a constant gap for any channel
  - 😞 Guaranteed gap to capacity is quite large and does not provide satisfactory performance guarantees at moderate transmission rates

# Bad Channels for IF/Linear Equalization

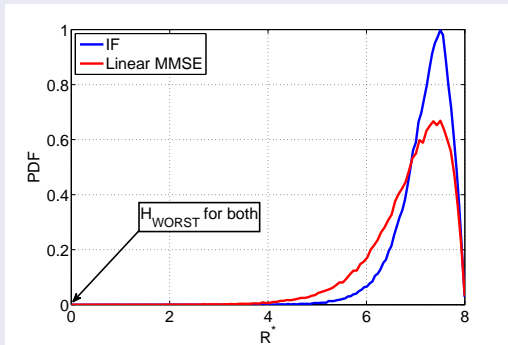



Figure: PDF of  $2 \times 2$  Rayleigh channels normalized to  $WI=8$  bits

- Worst channel  $\mathbf{H}_{\text{worst}} = \begin{bmatrix} 0 & 0 \\ 0 & 1 \end{bmatrix}$ : one stream  $\rightarrow$  



# Combating Bad Channels via Random Precoding

- What can we do against nature?
- Apply random precoding

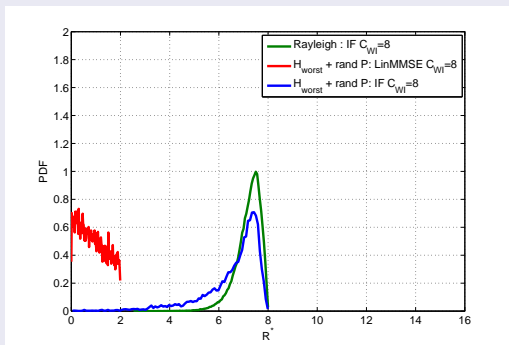


Figure: PDF of Random Unitary Precoding to  $\mathbf{H}_{\text{worst}}$

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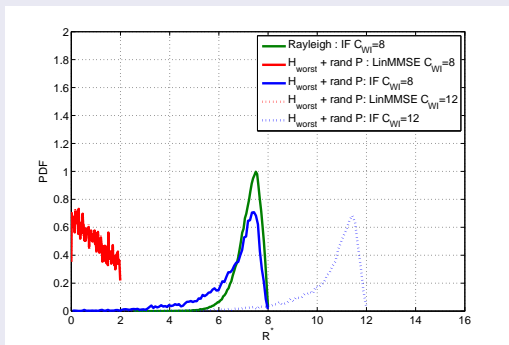


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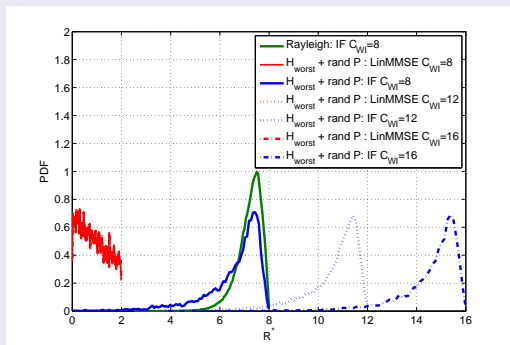


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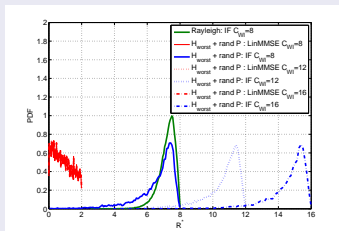


Figure: PDF of Random Unitary Precoding to  $\mathbf{H}_{\text{worst}}$

- No precoding can salvage linear eq. when channel is singular
- IF copes well with channel being singular

# Compound MIMO Channel Model

- $\mathbf{H}_c$  is part of the compound channel  $\mathbb{H}(C_{\text{WI}})$
- Mutual information of the compound channel is maximized by a Gaussian input with covariance matrix  $\mathbf{Q}$ :

$$C = \max_{\mathbf{Q}: \text{Tr} \mathbf{Q} \leq N_t \text{SNR}} \log \det \left( \mathbf{I}_{N_r \times N_r} + \mathbf{H}_c \mathbf{Q} \mathbf{H}_c^T \right)$$

- We set  $\text{SNR} = 1 \implies \mathbf{H}_c = \mathbf{H}_c \sqrt{\text{SNR}}$ , taking  $\mathbf{Q} = \mathbf{I}_{N_t \times N_t} \implies$   
 $C_{\text{WI}} = \log \det \left( \mathbf{I}_{N_r \times N_r} + \mathbf{H}_c \mathbf{H}_c^T \right)$
- Define:

$$\mathbb{H}(C_{\text{WI}}) = \left\{ \mathbf{H}_c \in \mathbb{C}^{N_r \times N_t} : \log \det \left( \mathbf{I} + \mathbf{H}_c^T \mathbf{H}_c \right) = C_{\text{WI}} \right\}$$

# Compound MIMO Channel Model

- PDF figures  $\implies$  for **most** precoding matrices good performance, however there is a tail (outage)...
- In contrast to Rayleigh channel all channels in the compound class has same mutual information  
 $\implies$  Define (**scheme outage**) probability which is taken w.r.t. random precoding ensemble , not w.r.t. to channel statistics
- Instead of constant gap, our target is to bound

$$P_{\text{out}}^{\text{WC}}(C_{\text{WI}}, R) = \sup_{\mathbf{H}_c \in \mathbb{H}(C_{\text{WI}})} P(R_{\text{IF}}(\mathbf{H}_c \cdot \mathbf{P}_c) < R)$$

- We assume  $\mathbf{P}_c$  is drawn from CUE  $\implies$  channels with equal eigenvalues have equal outage probability

## P-IF Performance

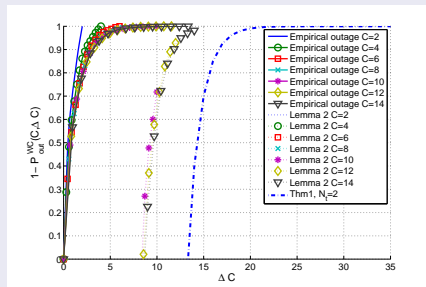


Figure:  $N_r \times 2$  complex channel achievable probability

- Empirical = grid of singular values  $\implies$  large number of random unitary matrices  $\implies$  worst-case outage probability
- Lemma 2 = grid of singular values  $\implies$  summation over all  $\mathbf{a} \in \mathbb{A}(R, N_t) \implies$  worst-case outage probability

## P-IF Performance

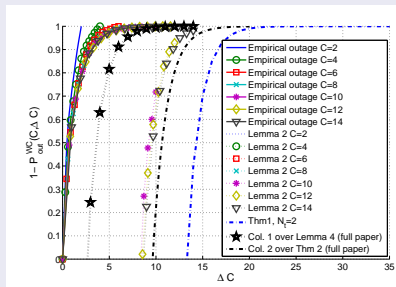


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# Universal Bound on Outage

## Theorem

For any  $N_r \times N_t$  complex channel with WI-MI  $C$ , and for  $\mathbf{V}_c$  drawn from the CUE (which induces a real-valued precoding matrix  $\mathbf{V}$ ), we have

$$P_{\text{out}}^{\text{WC}}(C, \Delta C) \leq c(N_t)2^{-\Delta C},$$

where

$$c(N_t) = \left[ \left( 2 + \frac{\sqrt{2N_t}}{2} \right)^{2N_t} - \left( 1 - \frac{\sqrt{2N_t}}{2} \right)^{2N_t} \right] N_t \alpha(N_t)^{N_t} \frac{\pi^{N_t}}{\Gamma(N_t+1)}$$

and

$$\alpha(N_t) = \frac{2N_t + 3}{4} \left( \frac{2}{\pi} \Gamma(2 + N_t)^{1/N_t} \right)^2.$$

Thus,  $c(N_t)$  is a constant that depends only on  $N_t$ .

# Application: Universal Bound for CL Achievable Rate

- A transmitter equipped with  $N_t$  transmit antennas wishes to send the same message to  $K$  users (each with  $N_{r,i}$  antennas)
- Channel matrix of user  $i$ :  $[\mathbf{H}_{c,i}]_{N_{r,i} \times N_t}$
- Set of channels:  $\mathcal{H} = \{\mathbf{H}_{c,i}\}_{i=1}^K$
- Multicast capacity

$$C(\mathcal{H}) = \max_{\mathbf{Q}: \text{Tr}(\mathbf{Q}) \leq N_t} \min_{\mathbf{H}_c \in \mathcal{H}} \log \det(\mathbf{I} + \mathbf{H}_c \mathbf{Q} \mathbf{H}_c^H)$$

- Absorbing the covariance matrix into the channel ( $\hat{\mathbf{H}}_{c,i} = \mathbf{H}_{c,i} \mathbf{Q}^{1/2}$ ) we assume that optimal input covariance matrix is the identity matrix
- Thus

$$C(\mathcal{H}) = \min_i C_{\text{WI}}(\hat{\mathbf{H}}_{c,i})$$

# Application: Universal Bound for CL Achievable Rate

- WLOG assume equal WI-MI for all users  $\implies \mathcal{H} \in \mathbb{H}(C_{\text{WI}})$
- $A_i(R)$  = the event where a random precoding matrix  $\tilde{\mathbf{V}}_c$  drawn from a CUE achieves a desired target  $R$  for user  $i$

$$A_i(R) = \left\{ \tilde{\mathbf{V}}_c : R_{\text{IF}}(\mathbf{H}_{c,i} \cdot \tilde{\mathbf{V}}_c) \geq R \right\}$$

## Union bound + probabilistic method:

- $P(\cap A_i(R)) \geq 1 - KP_{\text{out}}^{\text{WC}}(C(\mathcal{H}), R)$
- Guaranteed closed-loop rate

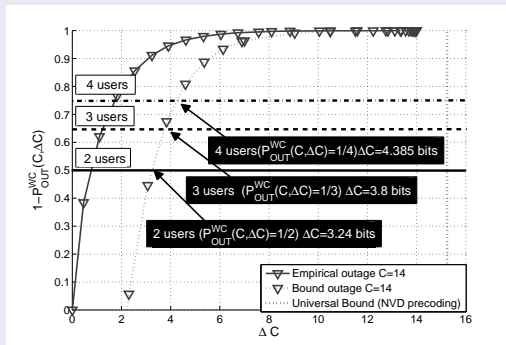
$$R_{\text{WC-CL}}(\mathcal{H}) = \min_R \left( P_{\text{out}}^{\text{WC}}(C(\mathcal{H}), R) > \frac{1}{K} \right)$$

- Since

$$P(\cap A_i(R_{\text{WC-CL}}(\mathcal{H}))) > 1 - K \cdot \frac{1}{K} = 0,$$

$\implies$  there exists a precoding matrix for which  $R_{\text{WC-CL}}(\mathcal{H})$  is achievable (via P-IF transmission)

# Universal Bound for CL WC Rate



**Figure:** Guaranteed closed-loop performance for  $N_r \times 2$  complex channels with 2,3,4 users

- Remark: Truth (as we believe...) is way better (Domanovitz '14 - outage with numerically optimized precoding matrix)