

Post-User-Selection Quantization and Estimation of Correlated Frobenius and Spectral Channel Norms

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Outline

- System Model
- Two Kinds of Channel Norms
- Feedback Quantization
- Estimation of SNR and Capacity
- Numerical Examples
- Summary



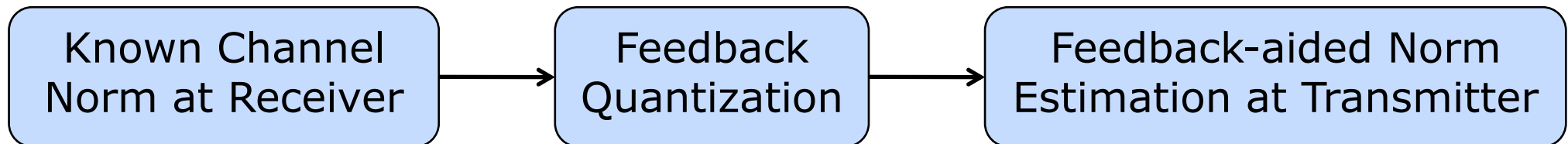
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Contributions

- Two independent frameworks
- Entropy-maximizing Quantization
 - Based on pre- and post-user-selection statistics
- MMSE SNR/Capacity Estimation
 - Closed-form Expressions
 - Based on arbitrary quantization



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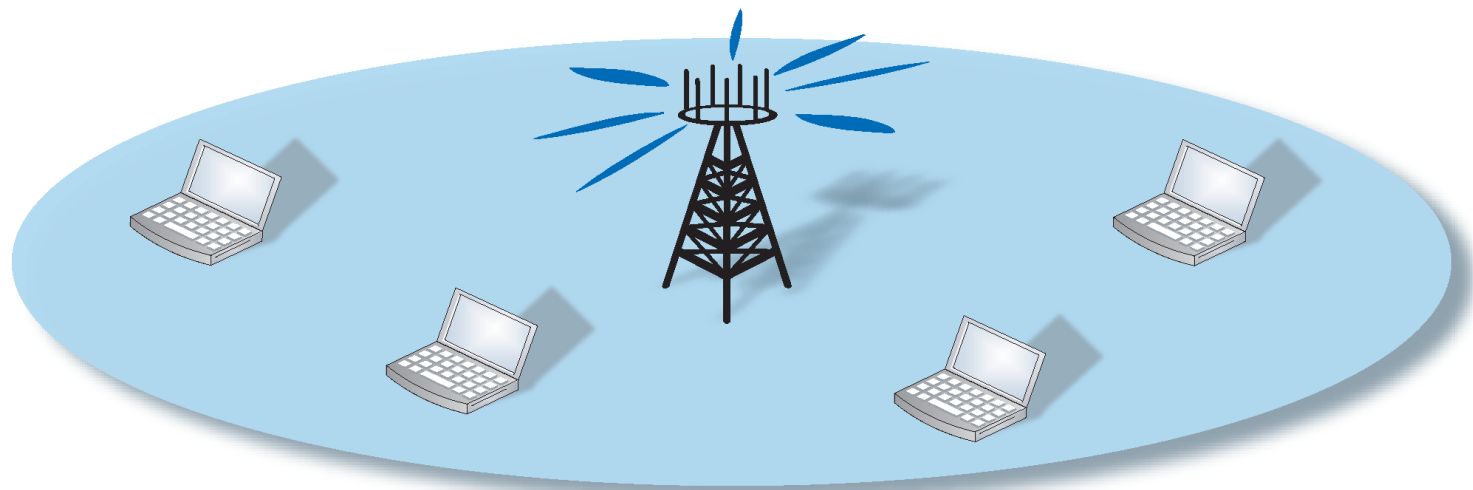


System Model

- Multi-user scenario
 - Scheduling (user selection)
 - Channel statistics are available
- Combination with norm/gain feedback
 - Improves scheduling and precoding



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System Model (2)

- MIMO Communication:
 - n_T transmit antennas, n_R receive antennas
- Rayleigh fading, one-sided correlation:

$$\mathbf{y}_k(t) = \mathbf{H}_k \mathbf{x}(t) + \mathbf{n}_k,$$

- $\mathbf{x}(t)$ transmitted signal, $E\{\|\mathbf{x}(t)\|_F^2\} = 1$
- $\mathbf{y}_k(t)$ received signal, noise $\mathbf{n}_k \in \mathcal{CN}(\mathbf{0}, \mathbf{I}_{n_T})$
- Distinct & Identical eigenvalues, or vice versa,

$$\mathbf{H}_k = \mathbf{R}_{\text{RX},k}^{1/2} \widetilde{\mathbf{H}}_k \mathbf{R}_{\text{TX},k}^{1/2}$$

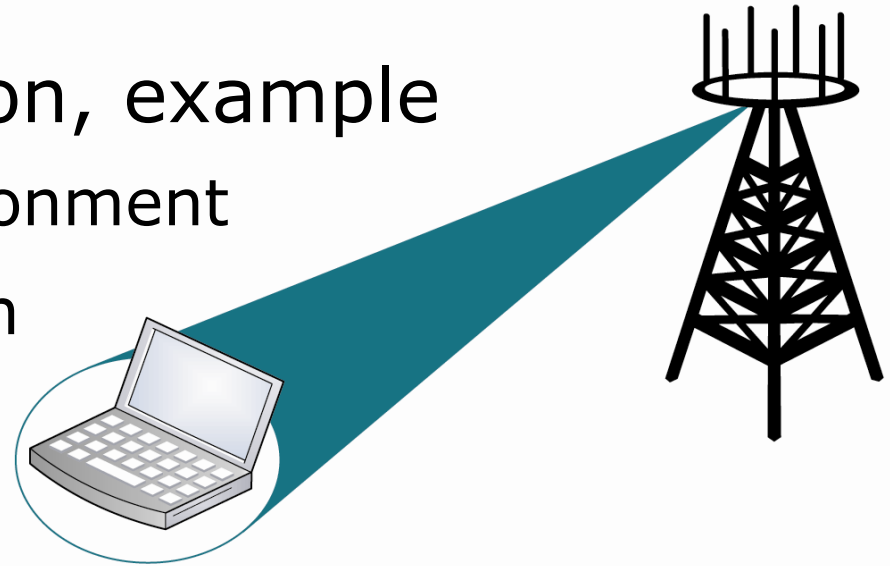
Known channel statistics



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System Model (3)

- One-sided correlation, example
 - Users in urban environment
 - Elevated base station



- Why a limitation to such correlation?
 - Less complicated mathematical expressions
 - More general closed-form expressions exist
 - The principles hold for general correlation!



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Two Kinds of Transmission

- Orthogonal Space-time Block Codes:
 - Perfect channel knowledge at receiver
 - Transmission in all spatial directions
 - Clever coding gives separable detection
- Maximum Ratio Transmission:
 - Perfect channel knowledge at receiver
 - Transmission in the strongest direction
 - Requires feedback of this direction
 - Gives better transmission performance



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Two Kinds of Channel Norms

- Orthogonal Space-time Block Codes:

$$\text{SNR}_k^{\text{OSTBC}} = \frac{\|\mathbf{H}_k\|_F^2}{n_T} = \frac{1}{n_T} \sum_{i=1}^n \sigma_i^2$$

Squared singular values
 $n = \min(n_T, n_R)$

- Squared Frobenius norm

- Maximum Ratio Transmission:

$$\text{SNR}_k^{\text{MRT}} = \|\mathbf{H}_k\|_2^2 = \sigma_1^2$$

- Squared Spectral norm
- Antenna diversity provided by feedback gives *largest* singular value instead of *average*



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Distribution of Channel Norms

- Cumulative distribution functions (CDFs)
 - Squared Frobenius norm

$$F_{\|\mathbf{H}\|_F^2}(\rho) = 1 - \frac{H_0(\rho)}{\prod_{i=1}^n \lambda_i^m} \sum_{k=1}^n \sum_{l=1}^m \frac{\Psi_{k,l,m}}{\left(-\frac{1}{\lambda_k}\right)^{m-l+1}} e^{-\frac{\rho}{\lambda_k}} \sum_{j=0}^{m-l} \frac{\left(\frac{\rho}{\lambda_k}\right)^j}{j!}$$

- Squared Spectral norm

$$F_{\|\mathbf{H}\|_2^2}(\mu) = \frac{\det \begin{bmatrix} \Phi \\ \Delta(\mu) \end{bmatrix} (-1)^{m(n-s)} H_0(\mu)}{\det(\mathbf{V}) \prod_{i=1}^s (m-i)!}$$

- Both can be expressed in closed form



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Feedback Quantization



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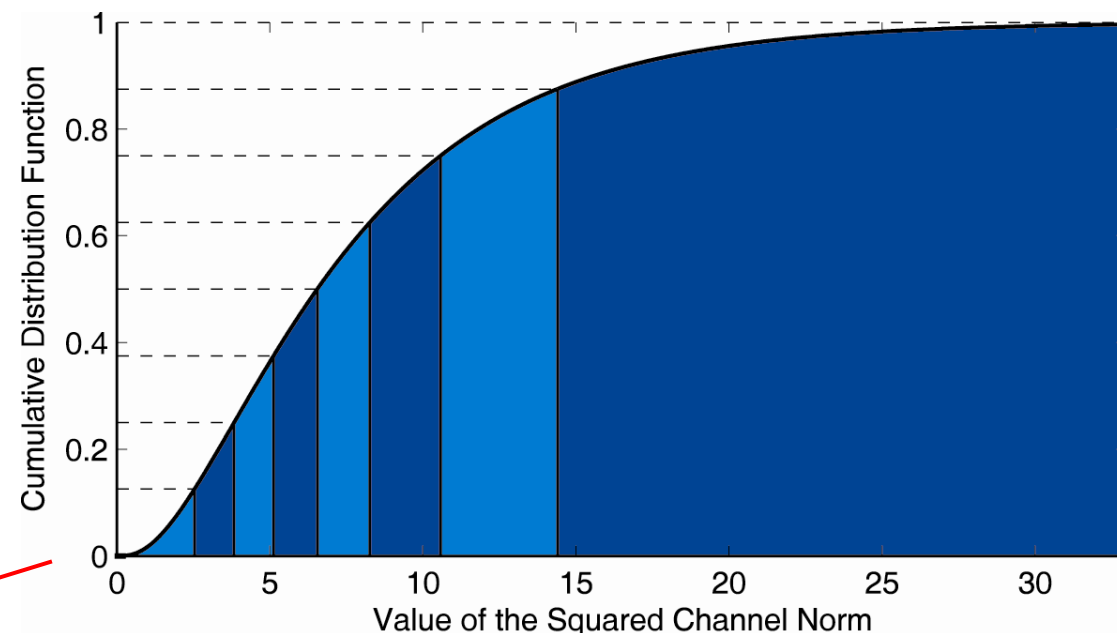
- Channel norms correspond to SNR
 - SNR feedback enables scheduling, precoding, and rate adaptation
 - Exact feedback requires infinitely many bits
- How to perform quantization?
 - Many different quality measures
 - Channel statistics known and should be used
- Entropy-maximizing quantization
 - Maximizes the information per feedback bit
 - Considered in this paper

Feedback Quantization (2)

- Entropy of feedback bits maximized by:
 - Divide $[0, \infty)$ into 2^L intervals $[A_{i-1}, A_i)$ with $A_0 = 0$, $A_{2^L} = \infty$, and

$$A_i = F^{-1}\left(\frac{i}{2^L}\right), \quad i = 1, \dots, 2^L - 1.$$

$F(\cdot)$ is the CDF
(e.g., of a
squared norm)



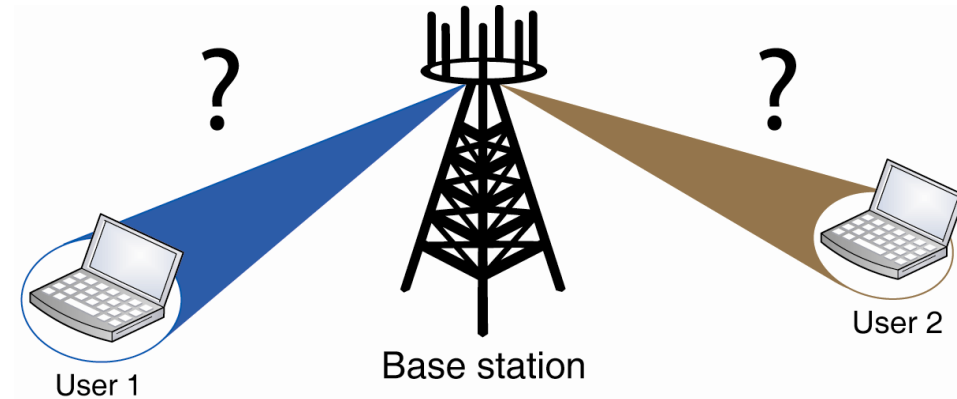
Example: 3 bits



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Feedback Quantization (3)

- N users
 - Select M users
 - Spatial separability and user SNR are quality measures
- When will norm feedback be used?
 1. User selection
 2. Precoding and rate adaptation
 - #2 requires more accurate information
 - Better to optimize quantization for #2 than #1



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Feedback Quantization (4)



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- Post-user-selection statistics
 - Strong users more probable to be selected
 - Very difficult to describe this mathematically
- Proposed scheduler:
 - Select the M users with largest $F_k(\text{SNR}_k)$
 - Good fairness, but ignores spatial separability
 - Post-user-selection CDF is $G_M(F_k(x))$,

where

$$G_M(x) = \sum_{i=0}^{M-1} \binom{N}{i} \frac{M-i}{M} x^{N-i} (1-x)^i$$

Gives statistics for
a selected user

Estimation of SNR & Capacity



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- Transmitter gets quantized norm feedback
 - Feedback says that norm belong to an interval
 - The value that best represents the squared norm depends on the statistics and application
- Estimation of functions of squared norm
 - We consider MMSE estimation given feedback
 - Two interesting functions: SNR and capacity
 - Closed-form expressions for these functions

Estimation of SNR & Capacity (2)

- MMSE Estimation of $g(\rho)$, with $\rho = \|\mathbf{H}_k\|_F^2$
 - Quantized feedback: $\rho \in [A, B)$

$$E\{g(\rho)|\mathcal{Q}_\rho\} = \frac{C}{\prod_{i=1}^n \lambda_i^m} \sum_{k=1}^n \sum_{l=1}^m \frac{\Psi_{k,l,m} G_{m-l,k}(A, B)}{(-1)^{m-l+1} (m-l)!},$$

- SNR $g(\rho) = \rho$:

$$G_{N,k}(A, B) = \left[-\frac{(N+1)!}{\left(\frac{1}{\lambda_k}\right)^{N+2}} e^{-\frac{\rho}{\lambda_k}} \sum_{i=0}^{N+1} \frac{\left(\frac{\rho}{\lambda_k}\right)^i}{i!} \right]_A^B$$

- Capacity $g(\rho) = \log_2(1 + \rho)$:

Similar closed-form expression as for SNR

Estimation of SNR & Capacity (3)

- MMSE Estimation of $g(\mu)$, with $\mu = \|\mathbf{H}_k\|_2^2$
 - Quantized feedback: $\mu \in [A, B)$

$$E\{g(\mu)|\mathcal{Q}_\mu\} = C \sum_{\alpha \in \mathcal{A}_n} \frac{\prod_{k=d+1}^n \lambda_{\alpha_k}^{t-k+1} \prod_{k=m-s+1}^m (k-1)!}{(-1)^{\text{per}(\alpha)} \prod_{k=1}^d (-\lambda_{\alpha_k})^{d-k}} \\ \times \sum_{l=1}^s (-1)^l \sum_{\beta \in \mathcal{B}_{l,s}} \sum_{k=0}^{K_l(\beta)} \sum_{\tilde{k} \in \tilde{\Omega}_k^{(l)}} \frac{1}{\tilde{k}_1! \cdots \tilde{k}_l!} \frac{\tilde{G}_{k,\beta}(A, B)}{\prod_{i=1}^l \lambda_{\alpha(\beta_i+d)}^{\tilde{k}_i}},$$

- Closed-form expressions of $\tilde{G}_{k,\beta}(A, B)$ for SNR $g(\mu) = \mu$ and capacity $g(\mu) = \log_2(1 + \mu)$

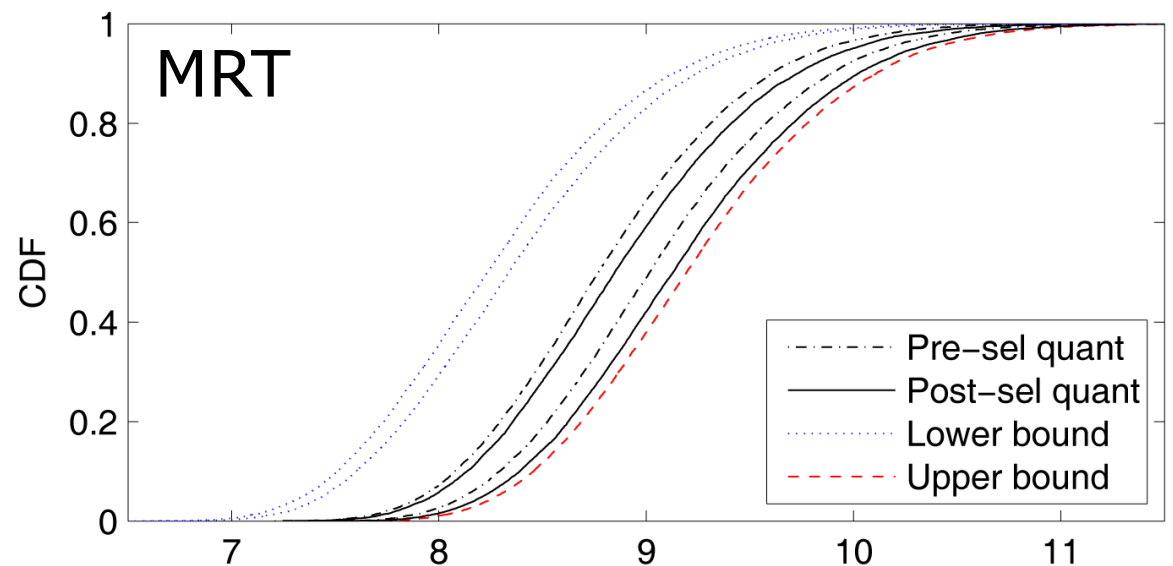
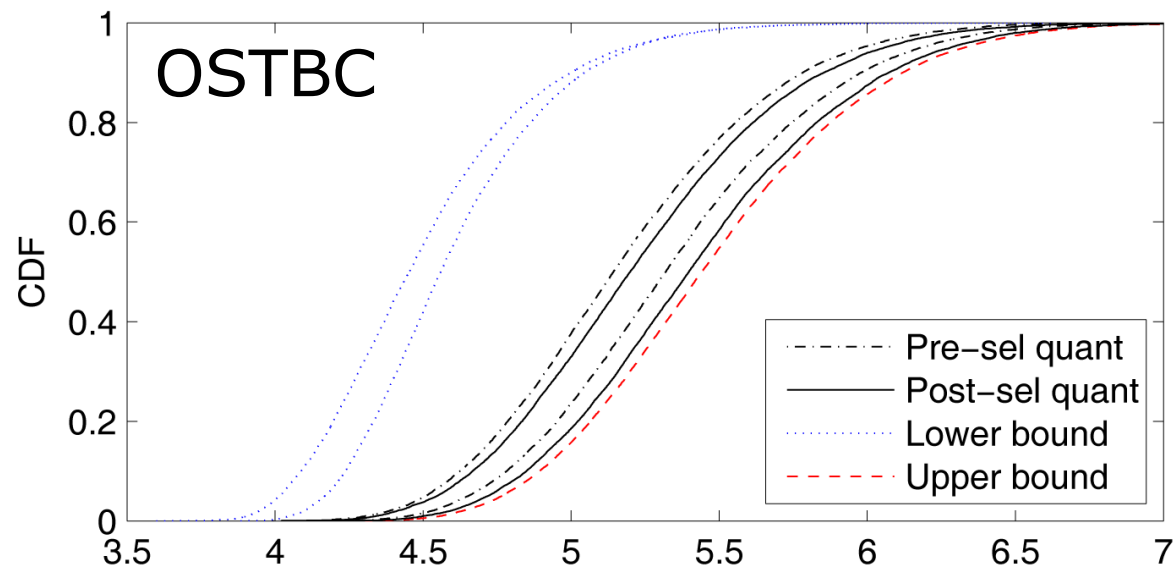
Numerical Examples



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- Downlink communication
 - Base station: 4 antennas, 15° angular spread
 - 8 Mobile users: 2 uncorrelated antennas
 - Circular cell, 10 dB at cell boundary
- 1 selected user (user k , highest $F_k(\text{SNR}_k)$)
- OSTBC (coding rate $\frac{3}{4}$)
- MRT (perfect directional feedback)
- Quantized feedback of squared norm

- Entropy-maximizing *Pre*-user-selection Quantization
- Entropy-maximizing *Post*-user-selection Quantization
- Lower bound (no correlation, no estimation)
- Upper bound/capacity (exact feedback)
- 3 bits: 95% of capacity
- 5 bits: 99% of capacity



Summary

- OSTBCs: $\text{SNR} = \text{Squared Frobenius Norm}$
- MRT: $\text{SNR} = \text{Squared Spectral Norm}$
- Entropy-Maximizing Quantization Framework (pre- and post-user-selection)
- MMSE Estimation of the SNR and Capacity (given quantized norm feedback)
- 3 bits of norm feedback: 95% of capacity (with exact norm feedback)



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Further Extensions

- Not limited to one-sided correlation
 - Similar expressions can be derived for general correlation (or Kronecker-structured)
- Proposed scheduler, just an example
 - This scheduler provides fairness and is analytical tractable, but somewhat idealized
 - When spatial separability is considered, the post-user-selection distribution can only be estimated numerically.
 - Important observation: Post-user-selection quantization can give a performance gain



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