



innovating communications

## CAPACITY AND SCHEDULING IN MULTI-USER MIMO SYSTEMS

A cross-layer approach

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ACE Course on MIMO Communication Systems and Antennas, KTH, Stockholm, Sept 5-9, 2005.

## REFERENCES

The sources of this seminar are mainly:

- T.M. Cover and J.A. Thomas, *Elements of Information Theory*, Wiley Series in Telecommunications, John Wiley & Sons, New York, 1991.
- D. Tse, P. Wiswanath, *Fundamentals of Wireless Communications*, Cambridge University Press, 2005. Chaps 5,6,10.
- A. Goldsmith *et al*, *Capacity Limits of MIMO Channels*, IEEE Trans. on Selected Areas in Communications, Vol. 21, No. 5, June 2003.
- H. Boche and M. Wiczanowski, *Queueing Theoretic Optimal Scheduling for Multiple Input Multiple Output Multiple Access Channel*, ISSPIT 2003, Darmstadt, Germany.

## MOTIVATION

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- Best way for multiple users to transmit over a shared medium? Orthogonal access? Simultaneous?
- Differences between uplink (multiple access) and downlink (broadcast) channels?
- Impact of multiple transmit and/or multiple receive antennas?
- In multi-user systems, can we take advantage of fading?
- Can the scheduling process be enhanced with channel-related information?
- Combined use of queue and channel information for scheduling?
- Information theory approach: keep it general !!

## OUTLINE

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- Motivation
- A review of capacity issues in single-user systems
  - ✓ Definition, Capacity for MIMO systems.
- Capacity issues in multi-user systems:
  - ✓ Broadcast (BC) and Multiple Access (MAC) channels.
  - ✓ Capacity regions for SISO BC & MAC. Sum capacity. Symmetric capacity.
  - ✓ Multi-user diversity. Channel-aware scheduling.
    - ✓ Fairness issues: Proportional Fair Scheduling
    - ✓ Slow-fading channels: Opportunistic Beamforming
- Channel- and queue-aware scheduling
  - ✓ Motivation
- Q&A

## OUTLINE

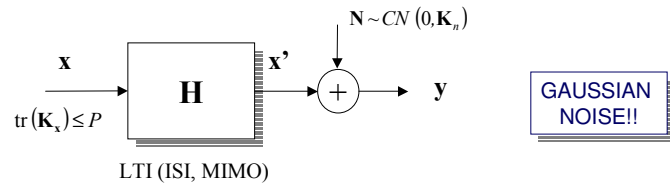
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- Motivation
- **A review of capacity issues in single-user systems**
  - ✓ Definition, Capacity for MIMO systems.

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## **A REVIEW OF CAPACITY ISSUES IN SINGLE-USER SYSTEMS**

## CAPACITY IN LINEAR TIME INVARIANT SYSTEMS



- Definition of mutual information

$$I(X; Y) = h(X) - h(X|Y) \quad \text{with} \quad h(X) = E_x(-\log f_x(x))$$

$$h(X|Y) = E_{xy}(-\log f_{x|y}(x|y))$$

- Information capacity of an AWGN channel with power constraint  $P$ :

$$C = \max_{f_x(x)} I(X; Y)$$

$$s.t. \quad \text{tr}(\mathbf{K}_x) \leq P$$

- Mutual information maximized for GAUSSIAN input:

$$\mathbf{X} \sim CN(0, \mathbf{K}_x)$$

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## CAPACITY IN LINEAR TIME INVARIANT SYSTEMS

- In these conditions, maximizing mutual information amounts to:

$$C = \max_{f_x(x)} I(X; Y) = \max_{\mathbf{K}_x} I(X; Y) = \max_{\mathbf{K}_x} \log \frac{|\mathbf{K}_n + \mathbf{H}\mathbf{K}_x\mathbf{H}^H|}{|\mathbf{K}_n|}$$

Noise + interference      Signal

s.t.  $\text{tr}(\mathbf{K}_x) \leq P$

- **Remarks:**

- In general,  $\mathbf{K}_x$  depends on  $\mathbf{H}$  and what information is available @ Tx side (partial, full, none).
- Units: bits/s/Hz...when  $\log = \log_2$
- Interpretation (Shannon's Channel Capacity Theorem): For every data rate  $R$ ...

**Information capacity (C) provides an upper bound of the achievable data rates (R)**

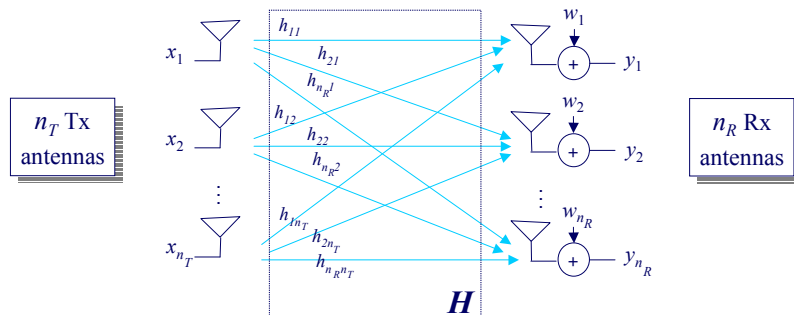
- Assumptions: Gaussian input symbols & ideal channel coding (and decoding)
- Useful equivalence:

$$C = \max_{\mathbf{K}_x} \log \frac{|\mathbf{K}_n + \mathbf{H}\mathbf{K}_x\mathbf{H}^H|}{|\mathbf{K}_n|} = \max_{\mathbf{K}_x} \log |\mathbf{I} + \mathbf{K}_n^{-1}\mathbf{H}\mathbf{K}_x\mathbf{H}^H|$$

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## MIMO CHANNEL MODEL



• Simplest model:

- Channel: Flat fading (frequency), static / independent Rayleigh fading (time)
- Noise: Gaussian (spatially) white  $\mathbf{N} \sim CN(0, \mathbf{K}_n) \rightarrow \mathbf{W} \sim CN(0, N_o \mathbf{I}_{n_R})$

$$\begin{bmatrix} y_1 \\ y_2 \\ \vdots \\ y_{n_R} \end{bmatrix} = \begin{bmatrix} h_{11} & h_{12} & \cdots & h_{1n_T} \\ h_{21} & h_{22} & \cdots & h_{2n_T} \\ \vdots & \vdots & \ddots & \vdots \\ h_{n_R 1} & h_{n_R 2} & \cdots & h_{n_R n_T} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_{n_T} \end{bmatrix} + \begin{bmatrix} w_1 \\ w_2 \\ \vdots \\ w_{n_R} \end{bmatrix} \quad \mathbf{y} = \mathbf{H}\mathbf{x} + \mathbf{w}$$

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## CAPACITY OF MIMO SYSTEMS (LTI)

$$C = \max_{\mathbf{K}_x} \log \left| \mathbf{I} + \mathbf{K}_w^{-1} \mathbf{H} \mathbf{K}_x \mathbf{H}^H \right| \quad \mathbf{K}_w = N_o \mathbf{I}_{n_R}$$

• **SISO**, Shannon Capacity

$$\mathbf{K}_x = P \quad (\mathbf{K}_w = N_o) \quad \Rightarrow \quad C = \log \left( 1 + \frac{P|h|^2}{N_o} \right) = \log(1 + \text{SNR})$$

Asympt growth

LOG in power

i.e. 1 bits/s/Hz every 3 dB

• **MIMO, no CSI at Tx** – Isotropic transmission:

$$\mathbf{K}_x = \frac{P}{n_T} \mathbf{I}_{n_T} \quad \Rightarrow \quad C = \log \left| \mathbf{I} + \frac{P}{N_o n_T} \mathbf{H} \mathbf{H}^H \right|$$

$$C \approx n \log \frac{P}{N_o n_T} + \sum_{i=1}^n \log \lambda_i^2$$

Asympt growth

LOG in power

LIN in antennas

i.e. n bits/s/Hz every 3 dB

• **MIMO, full CSI at Tx** – Waterfilling over channel eigenmodes (SVD):

$$\mathbf{K}_x = \mathbf{V} \text{diag}(P_1 \dots P_n) \mathbf{V}^H \quad \Rightarrow \quad C = \sum_{i=1}^n \log \left[ 1 + N_o^{-1} \lambda_i^2 P_i \right]$$

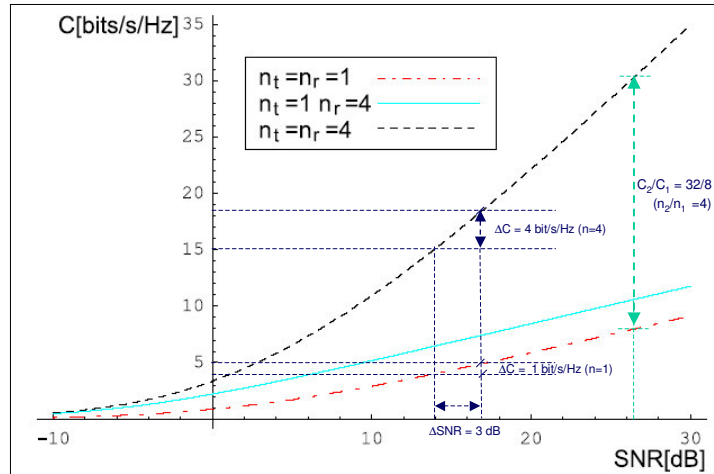
$$\mathbf{H} = \mathbf{U} \text{diag}(\lambda_1 \dots \lambda_n) \mathbf{V}^H$$

Power allocation (Lagrange):  $P_i(\lambda_i) = \left( \mu - \frac{N_o}{\lambda_i^2} \right)^+$   $i = 1 \dots n$   $\sum_{i=1}^n P_i = P$   $n = \min(n_T, n_R)$

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## CAPACITY OF MIMO SYSTEMS (LTI)



D. Tse, P. Wiswanath, *Fundamentals of Wireless Communications*, Cambridge Univ. Press. 2005

**SISO:** LOG in power

i.e. 1 bits/s/Hz every 3 dB

**MIMO:** LOG in power, LIN in antennas

i.e. n bits/s/Hz every 3 dB

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## OUTLINE

- Motivation
- A review of capacity issues in single-user systems
  - ✓ Definition, Capacity for MIMO systems, time-varying systems.
- **Capacity issues in multi-user systems:**
  - ✓ **Broadcast (BC) and Multiple Access (MAC) channels.**
  - ✓ **Capacity regions for SISO BC & MAC. Sum capacity. Symmetric capacity.**
  - ✓ **Multi-user diversity. Channel-aware scheduling.**
    - ✓ **Fairness issues: Proportional Fair Scheduling**
    - ✓ **Slow-fading channels: Opportunistic Beamforming**
  - ✓ **Capacity regions for MIMO BC & MAC. Duality principle.**

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## CAPACITY ISSUES IN MULTI-USER SYSTEMS

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## BROADCAST AND MULTIPLE-ACCESS CHANNELS

### Broadcast Channel (BC):

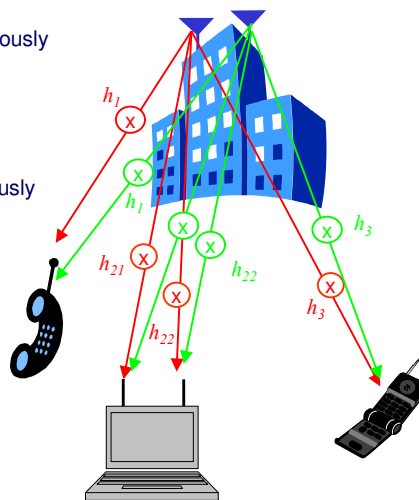
- Downlink
- One transmitter to many receivers simultaneously

### Multiple Access Channel (MAC):

- Uplink
- Many transmitters to one receiver simultaneously

### Remarks:

- Users can be regarded as an antenna array in a large area.
- Cooperation among antennas within the SAME location.
- Multiple antennas in one location enable Space Division Multiple Access or stream Multiplexing.



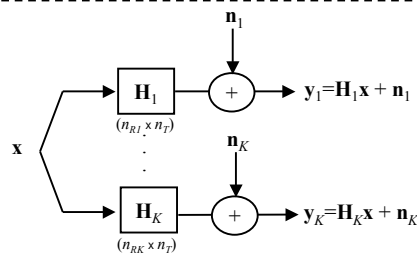
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## MIMO BC and MAC – CHANNEL MODEL

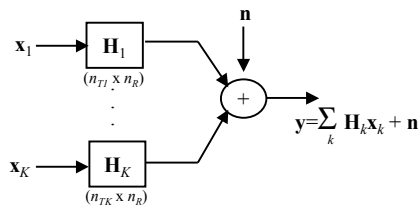
- One base station (BS) equipped with  $n_T$  ( $n_R$ ) antennas
- $K$  user equipments (UE) equipped with  $n_{Rk}$  ( $n_{Tk}$ ) antennas each

### BS Shared power constraint



Broadcast Channel (BC)

### UE individual power constraints

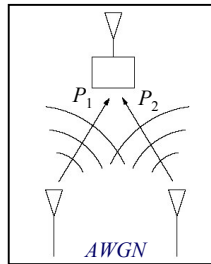


Multiple Access Channel (MAC)

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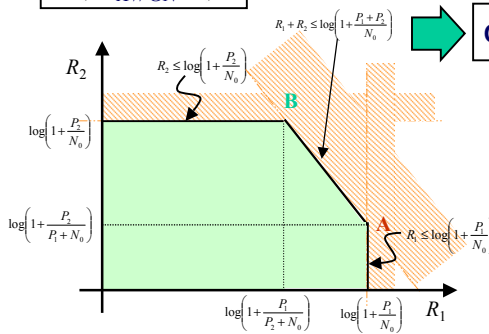
## CAPACITY REGION FOR MAC-AWGN



- SISO, MAC, AWGN channel,  $K=2$  users:

$$y[m] = x_1[m] + x_2[m] + w[m]$$

- **Single user:** Rate  $R$  achievable iff  $R < C \rightarrow C$  upper perf. bound
- **Multi-user:** UEs communicate with BS in a shared bandwidth  $\rightarrow$  trade-offs turning up!!
  - Set of achievable rates  $(R_1, R_2)$  with simultaneous communication??



CAPACITY REGION,  $C$ !!

- Characterizes *optimal* trade-off achievable by *any* MA scheme.
- User 2 gets  $R_2 > 0$  while user 1 attains single-user bound (A) !!
- HOW? *Successive interference Cancellation (SIC)*.
- Reversing detection order leads to different rate split (B) - fairness

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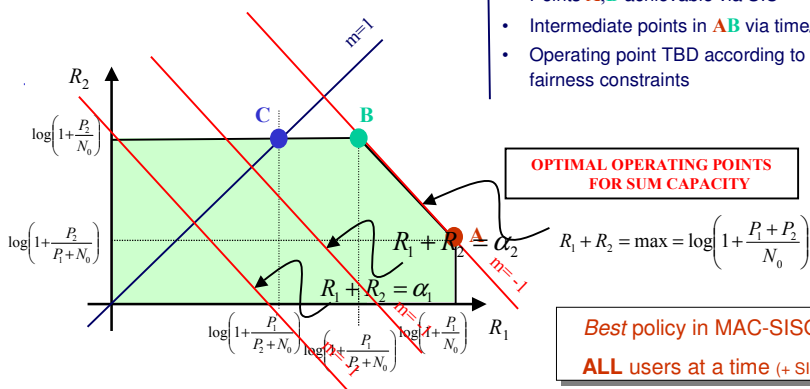


## MEASURES OF INTEREST

- Some performance measures (scalars) for a capacity region:

• **Sum capacity**  $C_{\text{sum}} := \max_{(R_1, R_2) \in C} R_1 + R_2$

- Reached at **AB** segment (ANY point)
- Points **A, B** achievable via SIC
- Intermediate points in **AB** via time/freq sharing
- Operating point TBD according to priorities or fairness constraints



• **Symmetric capacity**  $C_{\text{sym}} := \max_{(R, R) \in C} R$

- Reached @ boundary (near/far) - C

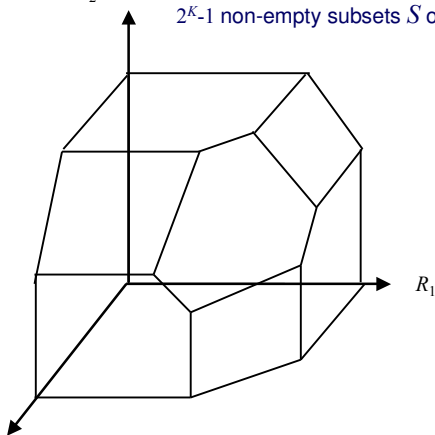
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## GENERAL CASE: MAC with K users

$$\sum_{k \in S} R_k \leq \log \left( 1 + \frac{\sum_{k \in S} P_k}{N_0} \right)$$

$R_2$   
 $2^K - 1$  constraints  
 $2^K - 1$  non-empty subsets  $S$  of users



$$R_1 \leq \log \left( 1 + \frac{P_1}{N_0} \right)$$

$$R_2 \leq \log \left( 1 + \frac{P_2}{N_0} \right)$$

$$R_3 \leq \log \left( 1 + \frac{P_3}{N_0} \right)$$

$$R_1 + R_2 \leq \log \left( 1 + \frac{P_1 + P_2}{N_0} \right)$$

$$R_2 + R_3 \leq \log \left( 1 + \frac{P_2 + P_3}{N_0} \right)$$

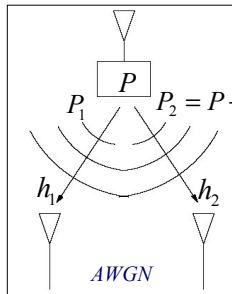
$$R_1 + R_3 \leq \log \left( 1 + \frac{P_1 + P_3}{N_0} \right)$$

$$R_1 + R_2 + R_3 \leq \log \left( 1 + \frac{P_1 + P_2 + P_3}{N_0} \right)$$

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## CAPACITY REGION FOR BC-AWGN



- SISO, BC, AWGN channel,  $K=2$  users:

$$y_1[m] = h_1 x[m] + w_1[m] \quad y_2[m] = h_2 x[m] + w_2[m]$$

- BS communicates with UE in a shared bandwidth & shared power ( $P$ )  $\rightarrow$  trade-offs turning up!!

- How to MUX data for both users at the BS?  $x[m] = ??$
- Set of achievable rates  $(R_1, R_2)$  with simultaneous comms.??

- Assume: User 2 is the "strongest" ( $|h_2| \geq |h_1|$ ) and superposition coding  $x[m] = x_1[m] + x_2[m]$
- If  $x_1$  decodable at UE<sub>1</sub> (weakest) in the presence of  $x_2$ , so is at UE<sub>2</sub> (strongest) for all power splits  $P_1, P_2$  (not possible if reversed order)

$$\text{SNIR}_{x_1 @ \text{UE}_1} = \frac{P_1 |h_1|^2}{(1-P_1)|h_1|^2 + N_0} \leq \frac{P_1 |h_2|^2}{(1-P_1)|h_2|^2 + N_0} = \text{SNIR}_{x_1 @ \text{UE}_2}$$

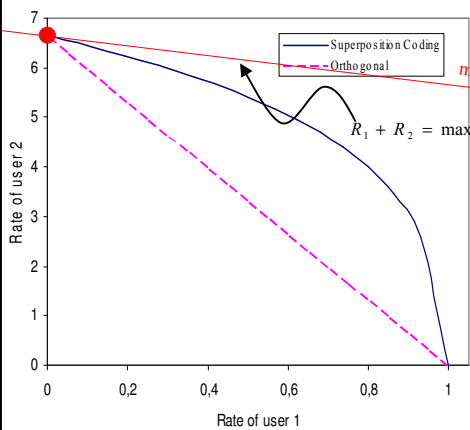
- So apply SIC at the strongest (UE<sub>2</sub>) and

$$R_1 = \log \left( 1 + \frac{P_1 |h_1|^2}{(P - P_1) |h_1|^2 + N_0} \right) \quad R_2 = \log \left( 1 + \frac{(P - P_1) |h_2|^2}{N_0} \right)$$

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## CAPACITY REGION FOR BC-LTI (cont'd)



$$R_1 = \alpha \log \left( 1 + \frac{P_1 |h_1|^2}{\alpha N_0} \right) \quad R_2 = (1-\alpha) \log \left( 1 + \frac{P_2 |h_2|^2}{(1-\alpha) N_0} \right)$$

$$\alpha = \alpha_{\text{opt}} = \frac{P_1}{P_1 + P_2} = \frac{P_1}{P}$$

Orthogonal multiple access

- SC boundary given by all  $P_1/P_2$  splits
- Sum-rate:** allocate ALL power to strongest user (UE<sub>2</sub>)  
...at the expense of delays!!

**Best policy in BC-SISO: ONE user at a time**

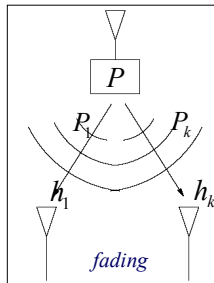
(vs. MAC-SISO: ALL users simultaneously)

- Orthogonal multiple access** strictly suboptimal for all power splits!!!
  - SC: low power for strong user (UE<sub>2</sub>) is efficiently exploited ( $x_1$  removed) and low interference to weaker (UE<sub>1</sub>)
- Remarks:**
  - Strong assumption: DEGRADED BC
  - MIMO is non degraded.
  - Degradation not needed in UL (centralized Rx & CSI).

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## BC CHANNEL WITH FADING



- SISO, BC, fading channel,  $K$  users:

$$y_k[m] = h_k[m]x[m] + w_k[m]$$

- Assumptions:
  - Fading processes ( $\{h_k[m]\}$ ): Independent and identically distributed (symmetric case).
  - Power constraint (pooled power):  $E_H \left[ \sum_{k=1}^K P_k[m] \right] = P$

- Take the case with CSIT (i.e power allocation possible):
  - AWGN: Sum capacity maximized by transmitting to the BEST user
  - Fading: Schedule the BEST user at EACH time (*greedy* approach). Equivalent point-to-point channel

$$|h|_{\text{eq}}^2 = \max_{k=1..K} |h_k|^2$$

- How to allocate power? Temporal waterfilling for the equivalent P2P channel

$$P^*(\mathbf{h}) = \left( \frac{1}{\lambda} - \frac{N_0}{\max_{k=1..K} |h_k|^2} \right)^+ \quad \longrightarrow \quad C_{\text{sum}} = E_h \left[ \log \left( 1 + \frac{P^*(\mathbf{h}) (\max_{k=1..K} |h_k|^2)}{N_0} \right) \right]$$

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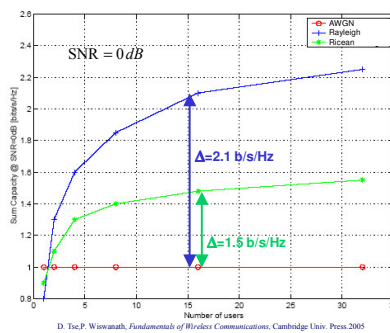
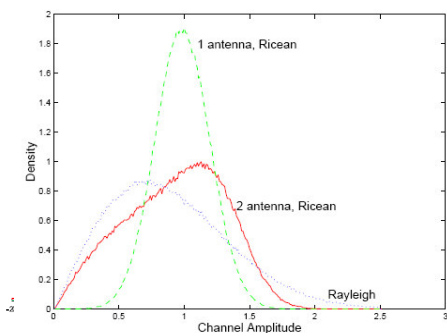
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## MULTI-USER DIVERSITY (MUDiv) GAIN

- With  $K$  users *FADING INDEPENDENTLY* and *OPPORTUNISTIC (DYNAMIC) SCHEDULING*, channel gain improves

$$|h_1|^2 \rightarrow |h|_{\text{eq}}^2 = \max_{k=1..K} |h_k|^2$$

Higher gain means higher (sum) rate!!



D. Tse, P. Waiwanath, Fundamentals of Wireless Communications, Cambridge Univ. Press 2005

- Gain wrt AWGN for  $K > 1$  (mid-high SNR)
- The amount of MUDiv increases with pdfs' tails: Rayleigh > Rice ( $\kappa=5$ , LOS, less "random")
- MUDiv gain increases with nr. of users ( $K$ ): the stronger is the strongest channel

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## MULTI-USER vs. CLASSICAL DIVERSITY

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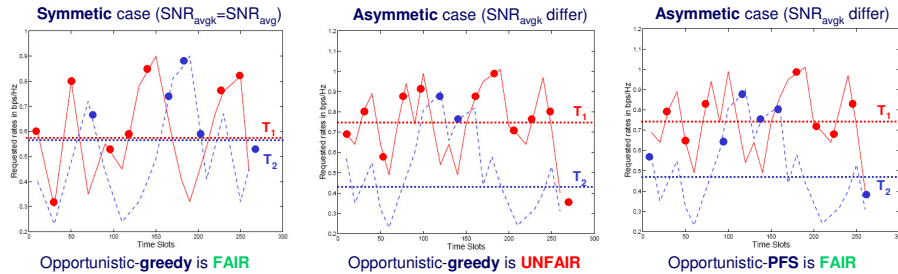
- **Purpose:**
  - Classical (time/frequency/space): Increase link *reliability* (slow fading)
  - MUDiv: Increase *average* cell *throughput* (fast fading)  
...but no rate guarantees in *specific* fading states
- **Means:**
  - Classical: *Counteract* adverse fading effects.
  - MUDiv: *Exploit* independent fading (capture strongest user)
- **Scope:**
  - Classical: Works at the *link* level
  - MUDiv: *System-wide* (active users)

## REMARKS ON MUDiv

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- **Signalling:**
  - UEs: Track their link quality (common pilot)
  - BS: Access to quality measurements (feedback channel)
- **Delay in the feedback channel** (ass.: delay&error free)
  - Mismatch actual channel-measured channel
  - FIX: ↓ scheduling slots ⇒ ↑ signalling overhead ⇒ selective MUDiv (f/b iff above threshold)
- **Fairness & delay:**
  - Non-homogeneous user set in real-world networks (assumed so far)
    - Different statistics (Rayleigh, Rice,...) average SNRs (near-far).. RESOURCE ALLOCATION ??
  - **FIX: Proportional Fair Scheduler (PFS)**

## PROPORTIONAL FAIR SCHEDULING (PFS)



- **Proportional Fair Scheduler:** Schedule user with *peak rate with respect to its average rate*

$$k^*[m] = \max_k \frac{R_k[m]}{T_k[m]} \quad T_k[m] = \begin{cases} (1-1/t_c)T_k[m] + (1/t_c)R_k[m] & k = k^* \\ (1-1/t_c)T_k[m] & k \neq k^* \end{cases}$$

- **PFS vs. greedy** opportunistic schedulers:
  - Both channel-dependent (vs. round-robin, vs. queue-based). PFS implemented in IS-856.
  - Greedy: No *short-term* fairness, captures MUDiv, maximizes *average* sum-rate.
  - PFS: No *short-term* fairness, *long-term* fairness (same # access), captures some MUDiv, loss in average sum-rate.
- Latency time scale ( $t_c$ ), a design parameter: if larger, larger averaging period, higher latency (schedule when hitting a really high peak)

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D. Tse/P. Wozniak, Fundamentals of Wireless Communications, Cambridge Univ. Press, 2005

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## REMARKS ON MUDiv

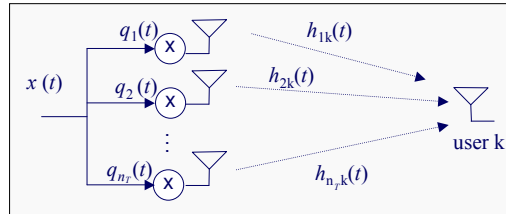
- **Signalling:**
  - UEs: Track their link quality (common pilot)
  - BS: Access to quality measurements (delay-free feedback channel)
- **Delay in the feedback channel** (ass.: delay & error free)
  - Mismatch actual channel-measured channel
  - FIX:  $\downarrow$  scheduling slots  $\Rightarrow \uparrow$  signalling overhead  $\Rightarrow$  selective MUDiv (f/b iff above threshold)
- **Fairness & delay:**
  - Non-homogeneous user set in real-world networks (assumed so far)
    - Different statistics (Rayleigh, Rice,...) average SNRs (near-far).. RESOURCE ALLOCATION ??
  - FIX: **Proportional Fair Scheduler (PFS)**
- **Limited and slow fluctuations** (ass: high & fast)
  - Limited: poor scattering/LOS – Slow : low mobility environment
  - Result: low cell throughput (peaks) - Delay requirements not met.
  - **FIX: Opportunistic beamforming.**

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## OPPORTUNISTIC BEAMFORMING

- Slow fading hurts: If all users fade slow  $\Rightarrow$  like  $K=1$  user  $\Rightarrow$  no MUDiv
- Limited fluctuation hurts: lower peak rates



$$\mathbf{q}[m] = [q_1[m] \dots q_{n_r}[m]]^T$$

$$\mathbf{h}_k[m] = [h_{1k}[m] \dots h_{n_rk}[m]]^T$$

with  $\|\mathbf{q}[m]\|^2 = 1$

- **TRICK (MISO):** Induce fast and high fluctuations by transmit beamforming with a time-varying common set of random weights (e.g circularly symmetric Gaussian):

$$y_k[m] = (\mathbf{h}_k^T[m] \mathbf{q}[m]) x[m] + w_k[m]$$

Random weights

$$\text{SNR}_k[m] = \frac{|\mathbf{h}_k^T[m] \mathbf{q}[m]|^2}{N_0}$$

measure at UE<sub>k</sub>  
feedback to BS

- **When are SNR peaks reached?:** When beam “points” at user  $k$

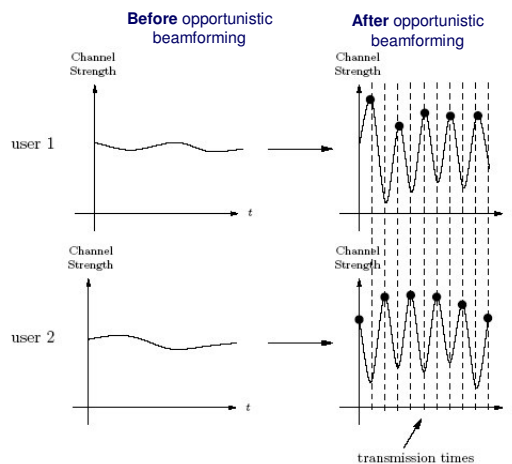
$$\mathbf{q}[m] \parallel \mathbf{h}_k^*[m]$$

“OPPORTUNISTIC BEAMFORMING”

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## OPPORTUNISTIC BEAMFORMING (cont'd)



- **How fast should  $\mathbf{q}[n]$  change?:** Design parameter:
  - *Fast enough* to induce fast fading
  - *Slow enough* for reliable channel estimation, timely feedback, stable loop.

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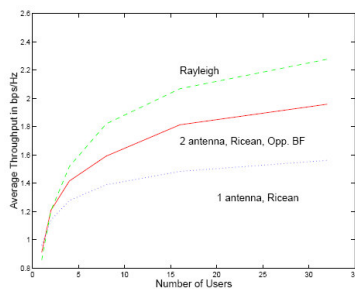
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## OPPORTUNISTIC BEAMFORMING (cont'd)

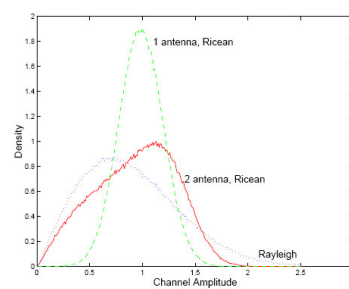
### DOES OPPORTUNISTIC BEAMFORMING ALWAYS HELP?

- Slow fading  $h_k[m] = h_k$  : Constant  $\rightarrow |h_k^* \mathbf{q}[m]|^2$  : Fast & high fluctuation YES
- Fast Rayleigh fading:  $h_k[m]$  : i.i.d. Gaussian  $\rightarrow h_k^* \mathbf{q}[m]$  : i.i.d. Gaussian NO  
 i.e. identical distribution for ANY distribution of  $\mathbf{q}$
- Fast Rician Fading:  $h_k[m] = h_k + h_{k,w}[m]$   $\rightarrow |h_k^* \mathbf{q}[m]|^2 = |h_k^* \mathbf{q}[m] + h_{k,w}^* \mathbf{q}[m]|^2$  YES

Additional power for FAST fluctuations No additional fluctuations



D. Tse, P. Waiwanath, Fundamentals of Wireless Communications, Cambridge Univ. Press 2005



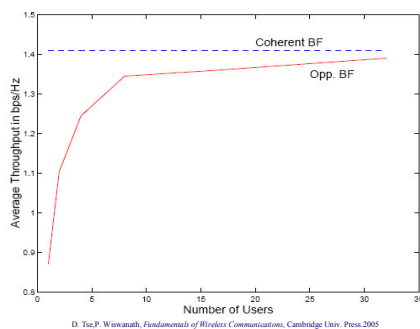
D. Tse, P. Waiwanath, Fundamentals of Wireless Communications, Cambridge Univ. Press 2005

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## REMARKS ON OPPORTUNISTIC BEAMFORMING

### Opportunistic vs. coherent beamforming:



D. Tse, P. Waiwanath, Fundamentals of Wireless Communications, Cambridge Univ. Press 2005

- Performance: Comparable for high  $K$  (always a user to point at)
- CSIT needs:
  - Opp.: SNR only (Opp.)!!!
  - Coherent: full CSI

### Multiple transmit antennas just for inducing fluctuations? Can we do better?

YES

**MULTIPLE ORTHOGONAL  
RANDOM BEAMS**

- + Still inducing fast fading
- + Additional spatial multiplexing gain (SDMA)
- Extra overhead for SNR measurements & feedback

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- Motivation
- A review of capacity issues in single-user systems
  - ✓ Definition, Capacity for MIMO systems.
- Capacity issues in multi-user systems:
  - ✓ Broadcast (BC) and Multiple Access (MAC) channels.
  - ✓ Capacity regions for SISO BC & MAC. Sum capacity. Symmetric capacity.
  - ✓ Multi-user diversity. Channel-aware scheduling.
    - ✓ Fairness issues: Proportional Fair Scheduling
    - ✓ Slow-fading channels: Opportunistic Beamforming
- **Channel- and queue-aware scheduling**
  - ✓ **Motivation.**
- Q&A

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## **CHANNEL- AND QUEUE-AWARE SCHEDULING**



## ASSUMPTIONS REVISITED

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- **Implicit assumptions so far...**
  - Ass. 1: *Infinite* transmit buffer size:
    - Users can be delayed without bound (to maximize sum-rate).
    - Did not care much about packet arrival rates.
  - Ass.2 : Scheduled user(s) always have data to transmit
- **BUT in realistic scenarios...**
  - *Finite* buffer size:
    - When close to buffer overflow, user should be scheduled regardless of channel conditions.
    - If too many packets arrive, buffer bound to explode.
  - Traffic is *bursty*: no point in scheduling a user with empty buffer!
- **CONCLUSION:** *Channel* and *queue* (buffer) information must be jointly considered in the scheduling process (i.e. cross-layer)

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## QUESTIONS ?