

# Lecture 8

## Multi-User MIMO

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# Multi-User MIMO System

- So far we discussed how multiple antennas increase the capacity and reliability in **point-to-point** channels
- Question: how do multiple antennas help in multi-user uplink and downlink channels?
- Spatial-Division Multiple Access (SDMA):
  - Multiple antennas provide spatial resolvability for distinguishing different users' signals
  - More spatial degrees of freedom for multiple users to share

# Plot

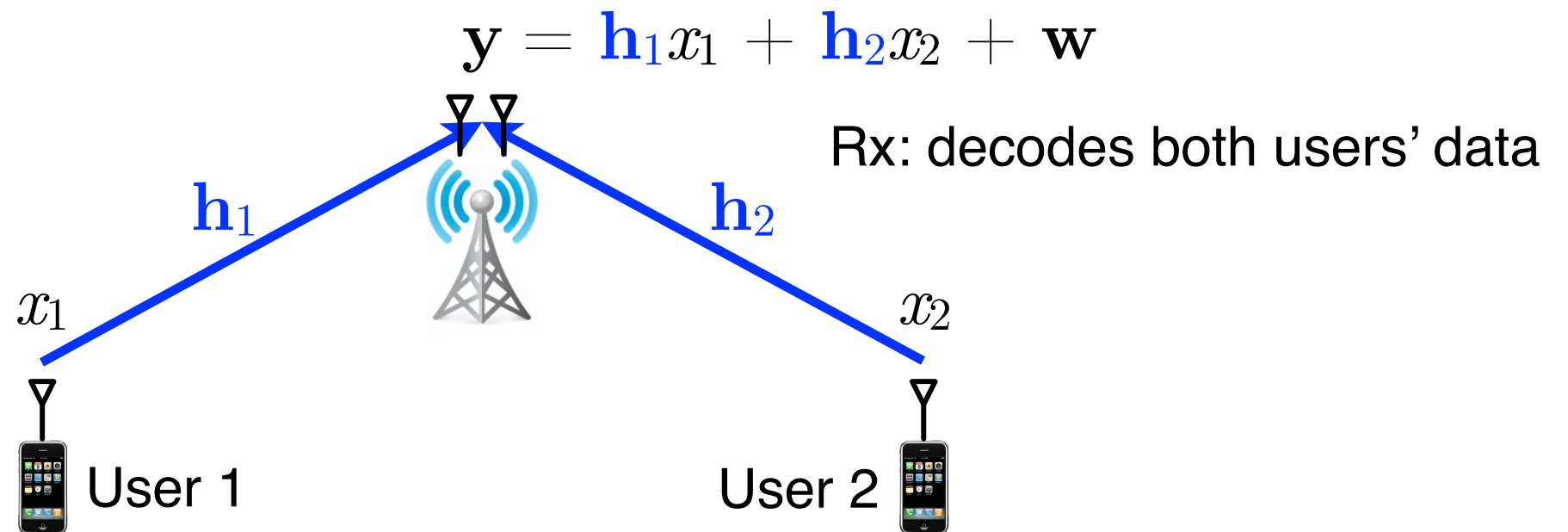
- First study uplink/downlink scenarios with single-antenna mobiles and a multi-antenna base station
- Achieve uplink capacity with MMSE and successive interference cancellation
- Achieve downlink capacity with uplink-downlink duality and dirty paper precoding
- Finally extend the results to MIMO uplink and downlink

# Outline

- Uplink with multiple Rx antennas
  - MMSE-SIC
- Downlink with multiple Tx antennas
  - Uplink-downlink duality
  - Dirty paper precoding
- MIMO uplink and downlink

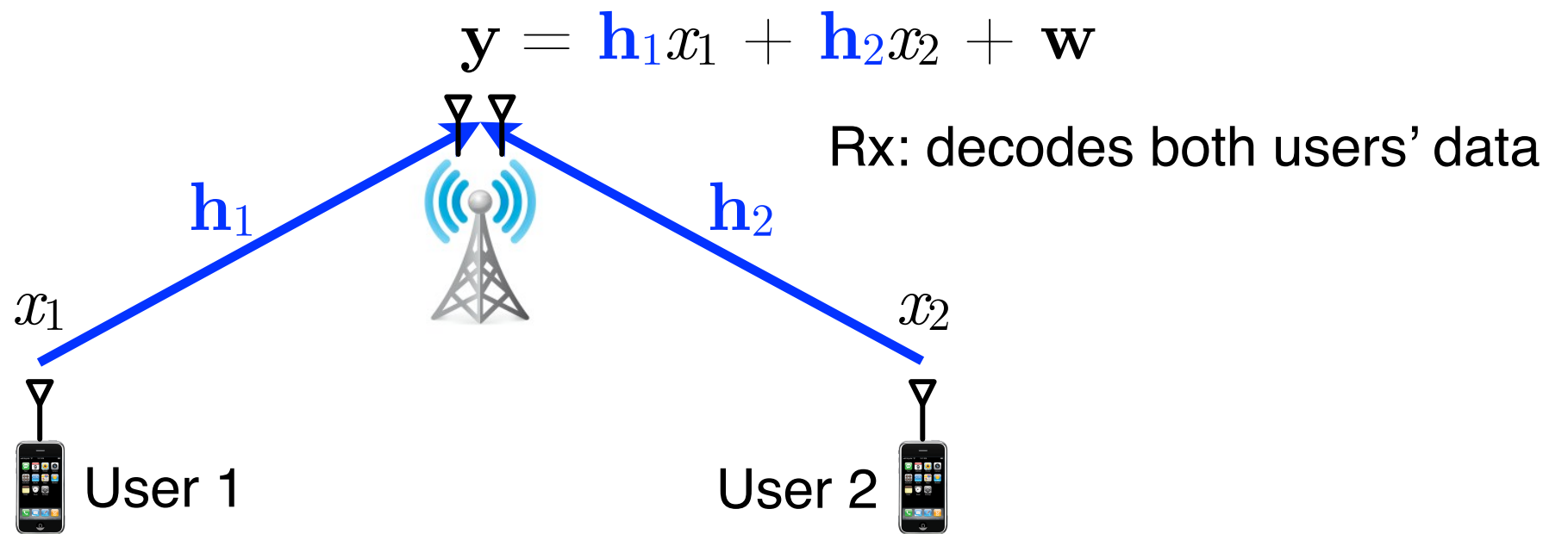
# **Uplink with Multiple Rx Antennas**

# Spatial Division Multiple Access



- Equivalent to the point-to-point MIMO using V-BLAST with identity precoding matrix
- Rx beamforming (linear filtering without SIC) distinguishes two users spatially (and hence the name spatial division multiple access (SDMA))
  - MMSE: the optimal filter that maximizes the Rx SINR
  - As long as the users are geographically far apart  $\Rightarrow \mathbf{H} := [\mathbf{h}_1 \ \mathbf{h}_2]$  is well-conditioned  $\Rightarrow$  2 spatial DoF for the 2 users to share

# Capacity Bounds

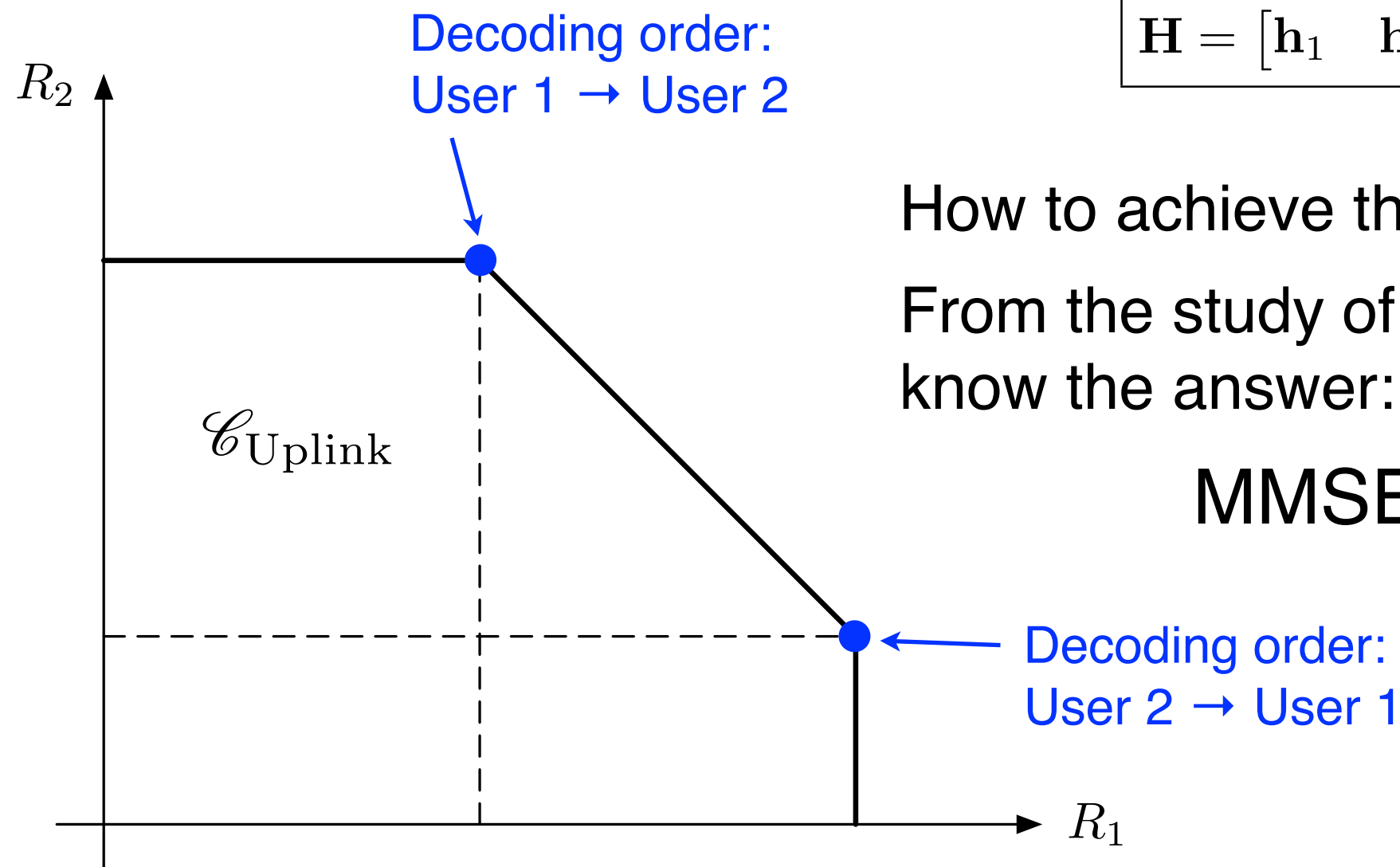


- Individual rates: each user is faced with a **SIMO** channel  
 $\implies R_k \leq \log \left( 1 + \frac{P_k}{\sigma^2} \|\mathbf{h}_k\|^2 \right), \quad k = 1, 2$
- Sum rate: viewed as a **MIMO** channel with V-BLAST and identity precoding matrix:  $(\mathbf{H} = [\mathbf{h}_1 \quad \mathbf{h}_2], \Lambda = \text{diag}(P_1, P_2))$   
 $\implies R_1 + R_2 \leq \log \det \left( \mathbf{I}_{n_r} + \frac{\mathbf{H}\Lambda\mathbf{H}^*}{\sigma^2} \right)$   
 $= \log \det (\mathbf{I}_{n_r} + P_1 \mathbf{h}_1 \mathbf{h}_1^* + P_2 \mathbf{h}_2 \mathbf{h}_2^*)$

# Capacity Region of the UL Channel

$$\mathcal{C}_{\text{Uplink}} = \bigcup \left\{ (R_1, R_2) \geq 0 : \begin{cases} R_1 \leq \log \left( 1 + \frac{P_1}{\sigma^2} \|\mathbf{h}_1\|^2 \right) \\ R_2 \leq \log \left( 1 + \frac{P_2}{\sigma^2} \|\mathbf{h}_2\|^2 \right) \\ R_1 + R_2 \leq \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \mathbf{H} \mathbf{\Lambda} \mathbf{H}^* \right) \end{cases} \right\}$$

$$\mathbf{H} = [\mathbf{h}_1 \quad \mathbf{h}_2], \quad \mathbf{\Lambda} = \text{diag}(P_1, P_2)$$



How to achieve the corner points?

From the study of V-BLAST we know the answer:

**MMSE-SIC!**



# $K$ -user Uplink Capacity Region

- The idea can be easily extended to the  $K$ -user case

$$\mathcal{C}_{\text{Uplink}} = \bigcup \left\{ \begin{array}{l} (R_1, \dots, R_K) \geq 0 : \\ \forall \mathcal{S} \subseteq [1 : K], \\ \sum_{k \in \mathcal{S}} R_k \leq \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \mathbf{H}_{\mathcal{S}} \mathbf{\Lambda}_{\mathcal{S}} \mathbf{H}_{\mathcal{S}}^* \right) \\ \qquad \qquad \qquad = \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \sum_{k \in \mathcal{S}} P_k \mathbf{h}_k \mathbf{h}_k^* \right) \end{array} \right\}$$

$$\mathbf{H}_{\mathcal{S}} := [\mathbf{h}_{l_1} \quad \mathbf{h}_{l_2} \quad \cdots \quad \mathbf{h}_{l_{|\mathcal{S}|}}], \quad l_1, \dots, l_{|\mathcal{S}|} \in \mathcal{S}$$

$$\mathbf{\Lambda}_{\mathcal{S}} := \text{diag} (P_{l_1}, P_{l_2}, \dots, P_{l_{|\mathcal{S}|}}), \quad l_1, \dots, l_{|\mathcal{S}|} \in \mathcal{S}$$

- Again, can be achieved using MMSE-SIC architectures

# Comparison with Orthogonal Access

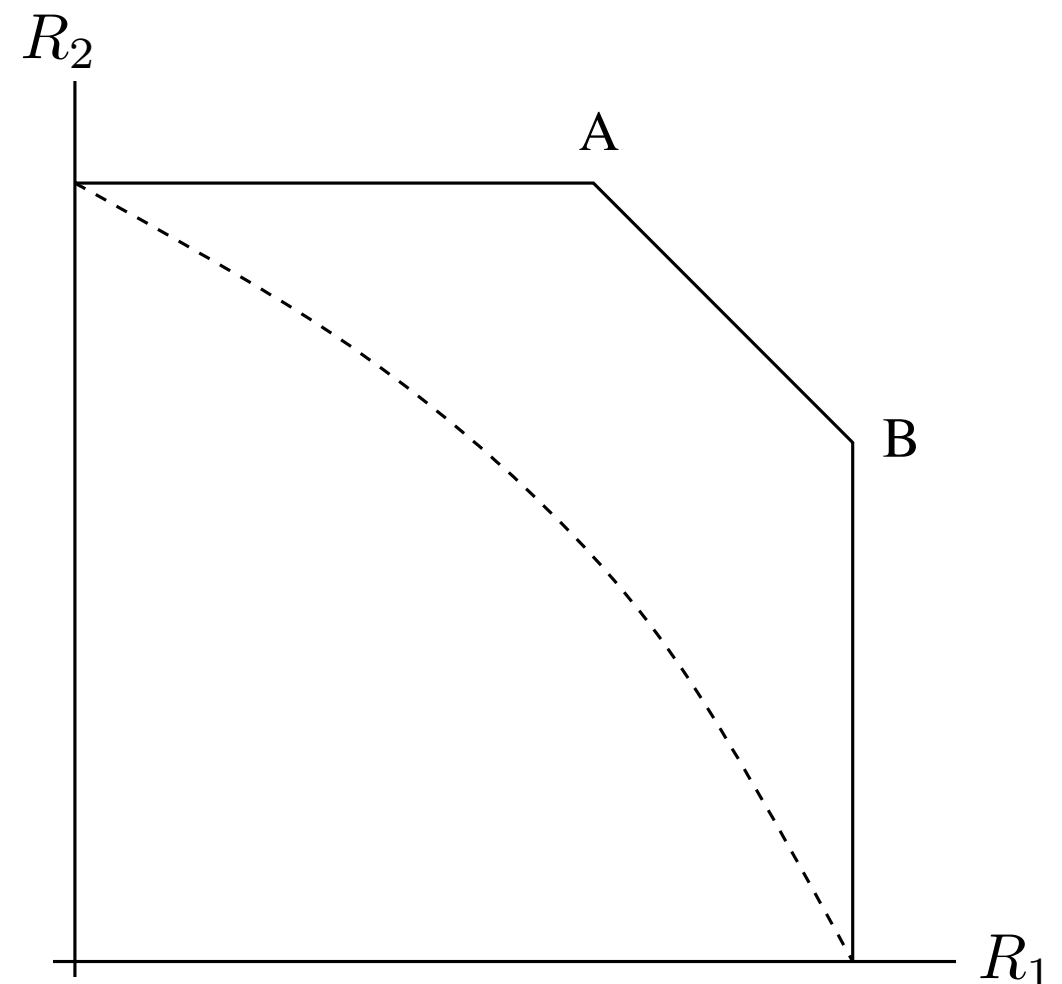
- Orthogonal multiple access can achieve

$$\begin{cases} R_1 = \alpha \log \left( 1 + \frac{P_1 \|\mathbf{h}_1\|^2}{\alpha \sigma^2} \right) \\ R_2 = (1 - \alpha) \log \left( 1 + \frac{P_2 \|\mathbf{h}_2\|^2}{(1 - \alpha) \sigma^2} \right) \end{cases} \quad \alpha \in [0, 1]$$

- Unlike the single-antenna case, it's cannot achieve the sum capacity

- In total only 1 spatial DoF

Because the rate expressions are the same as those in the single-antenna case!

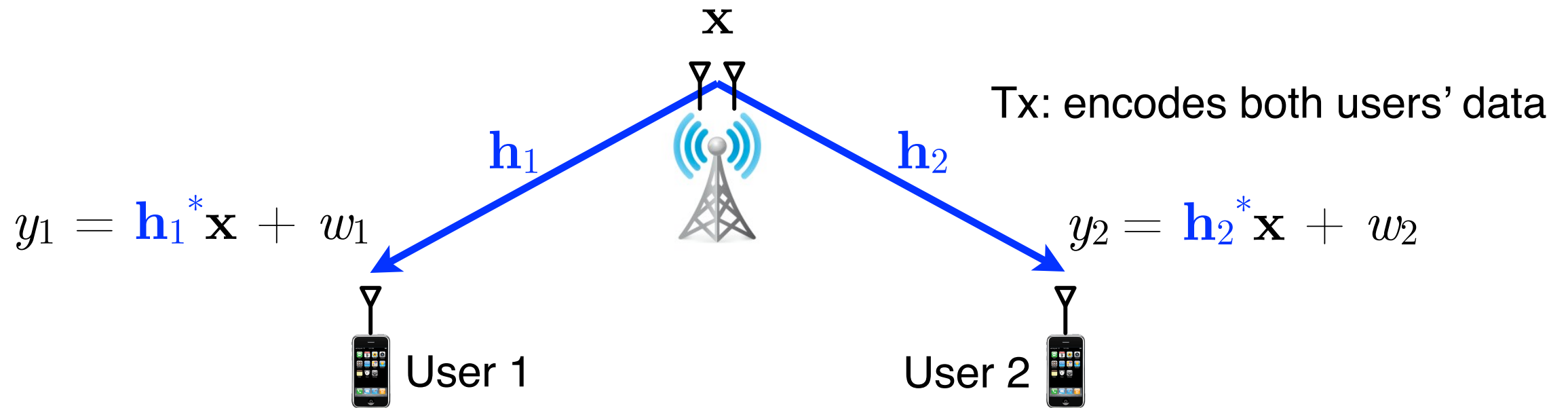


# Total Available Spatial DoF

- With  $K$  single-antenna mobiles and  $n_r$  antennas at the base station, the total # of spatial DoF is  $\min\{K, n_r\}$  .
- When  $K \leq n_r$  , the multi-antenna base station is able to distinguish all  $K$  users with SDMA
- When  $K > n_r$  , the multi-antenna base station cannot distinguish all  $K$  users
- Instead, divide the users into  $n_r$  groups: in each group, users share the single DoF by orthogonalization

# **Downlink with Multiple Tx Antennas**

# Downlink with Multiple Tx Antennas



- Superposition of two data streams:  $\mathbf{x} = \mathbf{u}_1 x_1 + \mathbf{u}_2 x_2$ 
  - $\mathbf{u}_k$ : Tx beamforming **signature** for user  $k$
- Downlink SDMA:
  - Design goal: given a set of SINR's, find the power allocation & the beamforming signatures s.t. the total Tx power is minimized
- Achieve 2 spatial DoF with  $\mathbf{u}_1 \perp \mathbf{h}_2$  &  $\mathbf{u}_2 \perp \mathbf{h}_1$ .
  - Similar to zero forcing (decorrelator) in point-to-point and uplink

# Downlink SDMA: Power Control Problem

- Finding the optimal Tx signatures & power allocation:
  - SINR of each user depends on **all the Tx signatures** (and the power allocation); in contrast to the uplink case
  - Hence maximizing **all** SINR is not a meaningful design goal
- Our design goal is to solve a power control problem:
  - Given a set of SINR's, find the power allocation & a set of Tx signatures such that the total amount of Tx power is minimized
  - It turns out that the power control problem is dual to a power control problem in a dual uplink channel
- Through the **uplink-downlink duality**, the downlink problem can be solved

# Uplink-Downlink Duality (1)

- Primal downlink:

- Superposition of data streams:  $\mathbf{x}_{\text{dl}} = \sum_{k=1}^K \mathbf{u}_k x_k$
- Received signals and SINR:

$$y_{\text{dl},k} = (\mathbf{h}_k^* \mathbf{u}_k) x_k + \sum_{j \neq k} (\mathbf{h}_k^* \mathbf{u}_j) x_j + w_{\text{dl},k}, \quad k = 1, \dots, K$$

$$\text{SINR}_{\text{dl},k} = \frac{P_k |\mathbf{h}_k^* \mathbf{u}_k|^2}{\sigma^2 + \sum_{j \neq k} P_j |\mathbf{h}_k^* \mathbf{u}_j|^2}, \quad k = 1, \dots, K$$

- Vector channel:  $\mathbf{y}_{\text{dl}} = \mathbf{H}^* \mathbf{x}_{\text{dl}} + \mathbf{w}_{\text{dl}}$

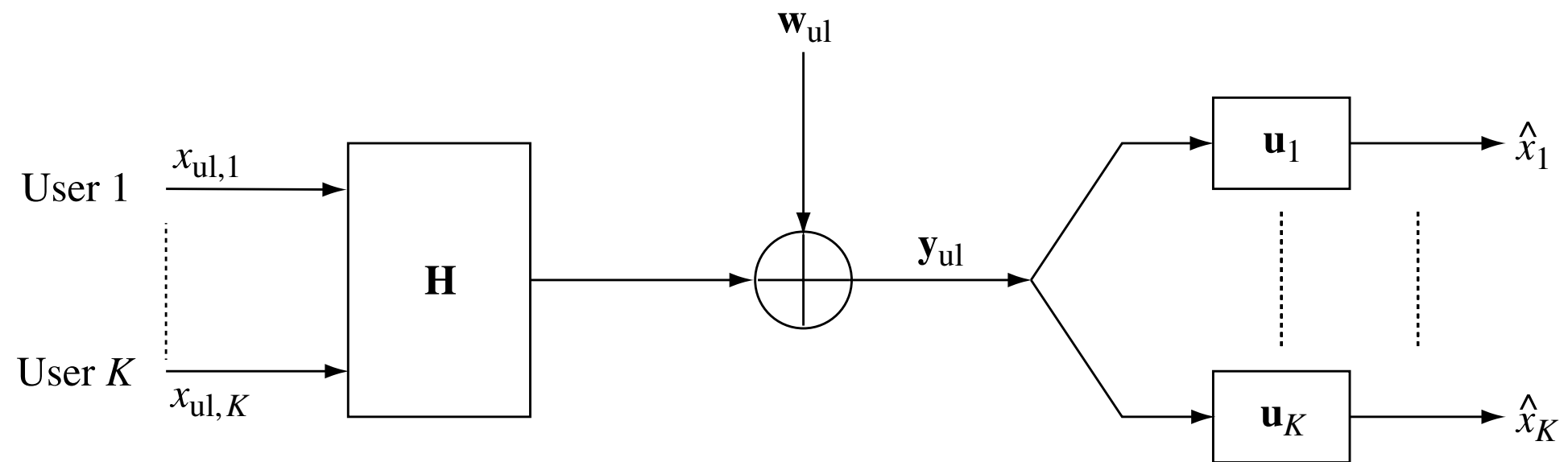
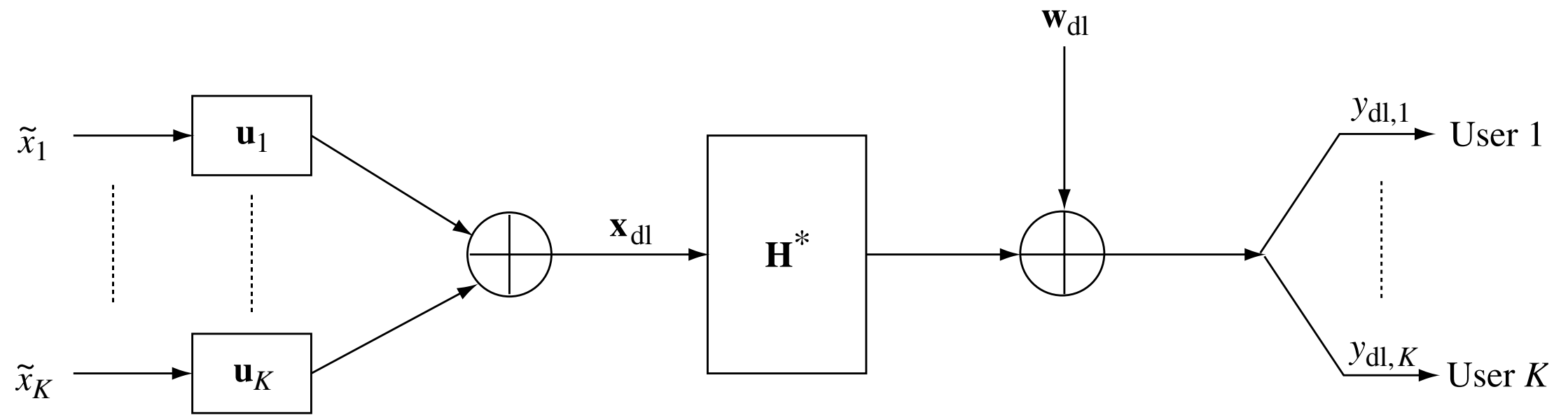
- Vector SINR: let  $a_k := \frac{1}{|\mathbf{h}_k^* \mathbf{u}_k|^2} \frac{\text{SINR}_{\text{dl},k}}{1 + \text{SINR}_{\text{dl},k}}, \quad k = 1, \dots, K$

- Let the matrix  $\mathbf{A}$  have entry  $A_{k,j} = |\mathbf{h}_k^* \mathbf{u}_j|^2$
- Then we have  $(\mathbf{I}_K - \text{diag}(\mathbf{a}) \mathbf{A}) \mathbf{p} = \sigma^2 \mathbf{a}$

- For given  $\{\mathbf{u}_k\}$ , we can compute the power vector  $\mathbf{p}$ :

$$\mathbf{p} = \sigma^2 (\mathbf{I}_K - \text{diag}(\mathbf{a}) \mathbf{A})^{-1} \mathbf{a} = \sigma^2 (D_{\mathbf{a}} - \mathbf{A})^{-1} \mathbf{1}$$

$$D_{\mathbf{a}} := \text{diag}(1/a_1, \dots, 1/a_K)$$





# Uplink-Downlink Duality (2)

- Dual uplink:
  - Vector channel:  $\mathbf{y}_{\text{ul}} = \mathbf{H}\mathbf{x}_{\text{ul}} + \mathbf{w}_{\text{ul}}$
  - Filtered output SINR:  $\text{SINR}_{\text{ul},k} = \frac{Q_k |\mathbf{u}_k^* \mathbf{h}_k|^2}{\sigma^2 + \sum_{j \neq k} Q_j |\mathbf{u}_k^* \mathbf{h}_j|^2}, \quad k = 1, \dots, K$
- Vector SINR: let  $b_k := \frac{1}{|\mathbf{h}_k^* \mathbf{u}_k|^2} \frac{\text{SINR}_{\text{ul},k}}{1 + \text{SINR}_{\text{ul},k}}, \quad k = 1, \dots, K$ 
  - Let the matrix  $\mathbf{B}$  have entry  $B_{k,j} = |\mathbf{u}_k^* \mathbf{h}_j|^2$
  - Then we have  $(\mathbf{I}_K - \text{diag}(\mathbf{b}) \mathbf{A}^T) \mathbf{q} = \sigma^2 \mathbf{b}$  since  $\mathbf{B} = \mathbf{A}^T$
- For given  $\{\mathbf{u}_k\}$ , we can compute the power vector  $\mathbf{q}$ :
$$\mathbf{q} = \sigma^2 (\mathbf{I}_K - \text{diag}(\mathbf{b}) \mathbf{A}^T)^{-1} \mathbf{b} = \sigma^2 (D_{\mathbf{b}} - \mathbf{A}^T)^{-1} \mathbf{1}$$
$$D_{\mathbf{b}} := \text{diag}(1/b_1, \dots, 1/b_K)$$

# Uplink-Downlink Duality (3)

- For the same  $\{\mathbf{u}_k\}$ , to achieve the same set of SINR ( $\mathbf{a}=\mathbf{b}$ ), the total Tx power of the UL and DL are the same:

$$\sum_{k=1}^K P_k = \sigma^2 \mathbf{1}^T (D_{\mathbf{a}} - \mathbf{A})^{-1} \mathbf{1} = \sigma^2 \mathbf{1}^T (D_{\mathbf{a}} - \mathbf{A}^T)^{-1} \mathbf{1} = \sum_{k=1}^K Q_k$$

- Hence, to solve the downlink power allocation and Tx signature design problem, we can solve the dual problem in the dual uplink channel
- Tx signatures will be the MMSE filters in the virtual uplink

# Beyond Linear Strategies

- Linear receive beamforming strategies for the uplink map to linear transmit beamforming strategies in the downlink
- But in the uplink we can improve performance by doing **successive interference cancellation** at the receiver
- Is there a dual to this strategy in the downlink?

# Transmit Precoding

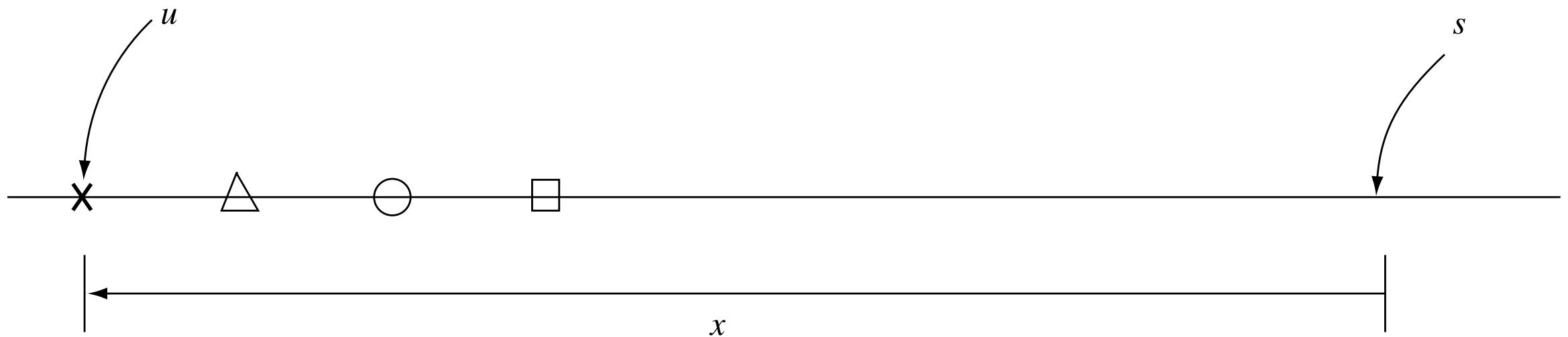
- In downlink Tx beamforming, signals for different users are superimposed and interfere with each other
- With a single Tx antenna, users can be ordered in terms of signal strength
  - A user can **decode and cancel all the signals intended for the weaker user** before decoding its own
- With multiple Tx antennas, no such ordering exists and no user may be able to decode information beamformed to other users
- However, the base station knows the information to be transmitted to every user and can **precode to cancel at the transmitter**

# Symbol-by-Symbol Precoding

- A generic problem:  $y = x + s + w$ 
  - $x$  : desired signal
  - $s$  : interference known to Tx but unknown to Rx
  - $w$  : noise
- Applications:
  - Downlink channel:  $s$  is the signal for other users
  - ISI channel:  $s$  is the intersymbol interference

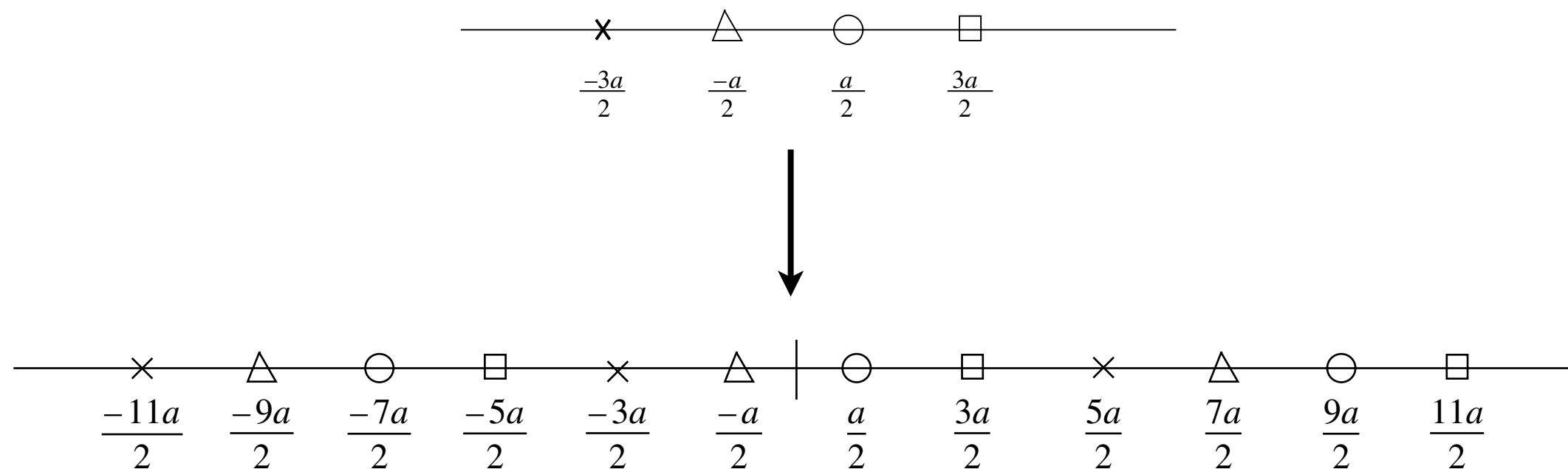
# Naive Pre-Cancellation Strategy

- Want to send point  $u$  in a 4-PAM constellation
- Transmit  $x = u - s$  to pre-cancel the effect of  $s$
- But this is very power inefficient if  $s$  is large



# Tomlinson-Harashima Precoding (1)

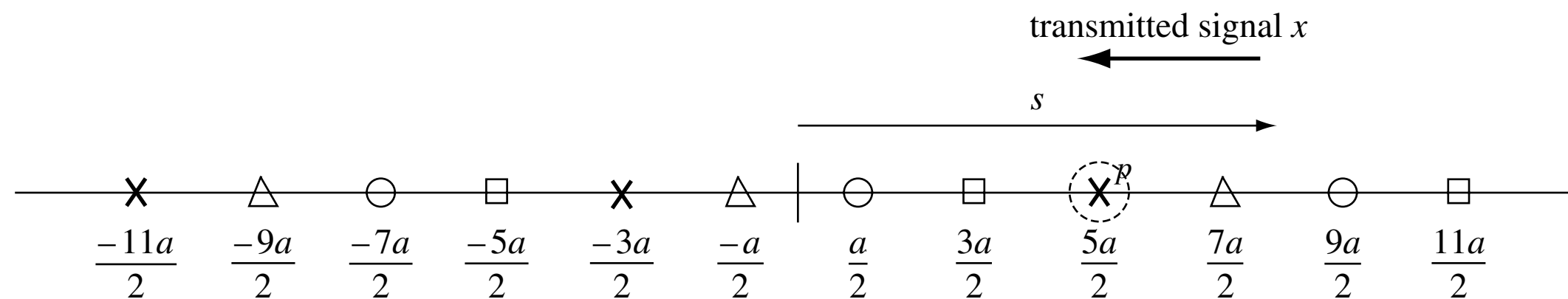
- Replicate the PAM constellation to tile the whole real line



- Represent information  $u$  by an equivalent class of constellation points instead of a single point

# Tomlinson-Harashima Precoding (2)

- Given  $u$  and  $s$ , find the point in its equivalent class closest to  $s$  and transmit the difference





# Writing on Dirty Paper

- Can extend this idea to block precoding
  - Problem is to design codes which are simultaneously good source codes (vector quantizers) as well as good channel codes
- Somewhat surprising, information theory guarantees that one can get to the **capacity** of the AWGN channel with the **interference completely removed**
- Applying this to the downlink, can perform SIC at the transmitter
- The pre-cancellation order in the downlink is the reverse order of the SIC in the dual uplink

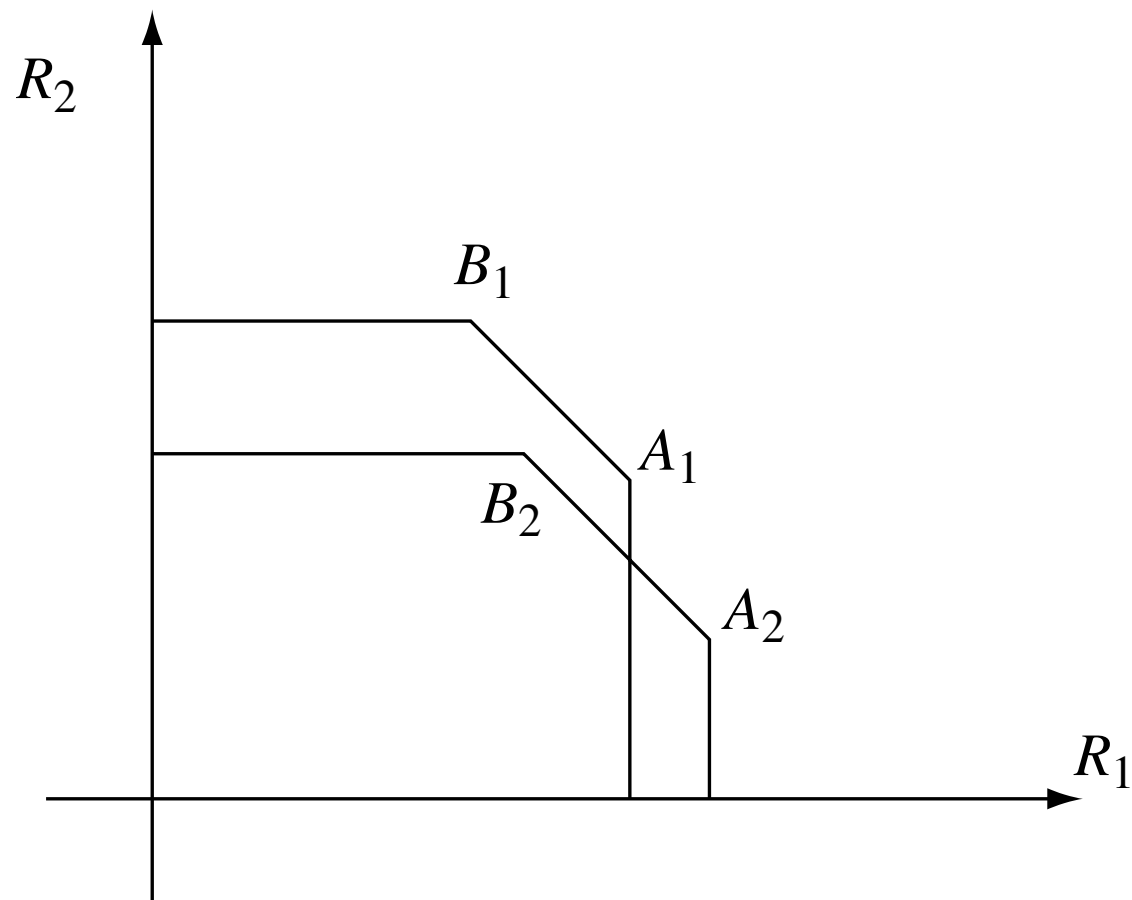
# MIMO Uplink and Downlink

# MIMO Uplink

- Channel model:  $\mathbf{y} = \mathbf{H}_1 \mathbf{x}_1 + \mathbf{H}_2 \mathbf{x}_2 + \mathbf{w}$
- Now the mobiles (Tx) have multiple antennas, and hence can form their own Tx covariance matrices
- For the two-user case, capacity bounds become
  - Individual rate bounds:
$$R_k \leq \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \mathbf{H}_k \mathbf{K}_{\mathbf{x}_k} \mathbf{H}_k^* \right), \quad k = 1, 2$$
  - Sum rate bound:
$$R_1 + R_2 \leq \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \sum_{k=1}^2 \mathbf{H}_k \mathbf{K}_{\mathbf{x}_k} \mathbf{H}_k^* \right)$$
- Note: in general there are no single  $\mathbf{K}_{\mathbf{x}_1}$  and  $\mathbf{K}_{\mathbf{x}_2}$  that can simultaneously maximize the three rate constraints

# Capacity Region (Two Users)

$$\mathcal{C}_{\text{Uplink}} = \text{conv} \bigcup_{\substack{k=1,2, \mathbf{K}_{\mathbf{x}_k} \succeq 0 \\ \text{Tr}(\mathbf{K}_{\mathbf{x}_k}) \leq P_k}} \left\{ \begin{array}{l} (R_1, R_2) \geq 0 : \\ R_k \leq \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \mathbf{H}_k \mathbf{K}_{\mathbf{x}_k} \mathbf{H}_k^* \right), \quad k = 1, 2 \\ R_1 + R_2 \leq \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \sum_{k=1}^2 \mathbf{H}_k \mathbf{K}_{\mathbf{x}_k} \mathbf{H}_k^* \right) \end{array} \right\}$$



Two pentagon regions are achieved by different choices of  $\mathbf{K}_{\mathbf{x}_1}$  and  $\mathbf{K}_{\mathbf{x}_2}$

Hence the capacity region is NOT a pentagon region anymore

MMSE-SIC can achieve all corner points in each pentagon region

# MIMO Uplink with Fast Fading (1)

- Full CSI: need to solve a joint optimization problem regarding power allocation and precoding matrix design
  - **Cannot use SVD** because the two channel matrices may not have the same factoring left matrix  $\mathbf{U}$
  - The problem can be solved by iterative water-filling efficiently
  - Reference: W. Yu *et al*, “Iterative Water-Filling for Gaussian Vector Multiple-Access Channels,” IEEE Transactions on Information Theory, vol.50, no.1, pp.145 – 152, January 2004

# MIMO Uplink with Fast Fading (2)

- Receiver CSI:
  - Capacity region is the convex hull of the collection of rate pairs  $(R_1, R_2)$  that satisfy the following inequalities for some covariance matrix  $\mathbf{K}_{\mathbf{x}_1}$  and  $\mathbf{K}_{\mathbf{x}_2}$  with  $\text{Tr}(\mathbf{K}_{\mathbf{x}_1}) < P_1$  and  $\text{Tr}(\mathbf{K}_{\mathbf{x}_2}) < P_2$  :
$$R_k \leq \mathbb{E} \left[ \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \mathbf{H}_k \mathbf{K}_{\mathbf{x}_k} \mathbf{H}_k^* \right) \right], \quad k = 1, 2$$
$$R_1 + R_2 \leq \mathbb{E} \left[ \log \det \left( \mathbf{I}_{n_r} + \frac{1}{\sigma^2} \sum_{k=1}^2 \mathbf{H}_k \mathbf{K}_{\mathbf{x}_k} \mathbf{H}_k^* \right) \right]$$
- For i.i.d. Rayleigh  $\{\mathbf{H}_k\}$ , it is straightforward to see that uniform power allocation and identity precoding matrices maximize all bounds simultaneously  
 $\Rightarrow$  the capacity region is a pentagon with  $\mathbf{K}_{\mathbf{x}_k} = \frac{P_k}{n_{t,k}} \mathbf{I}_{n_{t,k}}$

# Nature of Performance Gains

- For the uplink MIMO, regardless of CSIT, the total # of spatial DoF is  $\min \left\{ \sum_{k=1}^K n_{t,k} , n_r \right\}$
- CSIT is NOT crucial in obtaining multiplexing gain in the uplink, as long as receiver CSI is available
- Power gain is increased with CSIT
- Multi-user diversity gain is limited

# MIMO Downlink

- Compared to the case with single-antenna users, one needs to further design the receive filters at the users
- Uplink-downlink duality can be naturally extended to the case with multiple Rx antennas:
  - The Rx linear filters are the Tx linear precoding filters in the dual uplink channel
- Hence in the case without fading, the sum capacity of the MIMO downlink channel is equal to that of the dual uplink channel (with total power constraint)

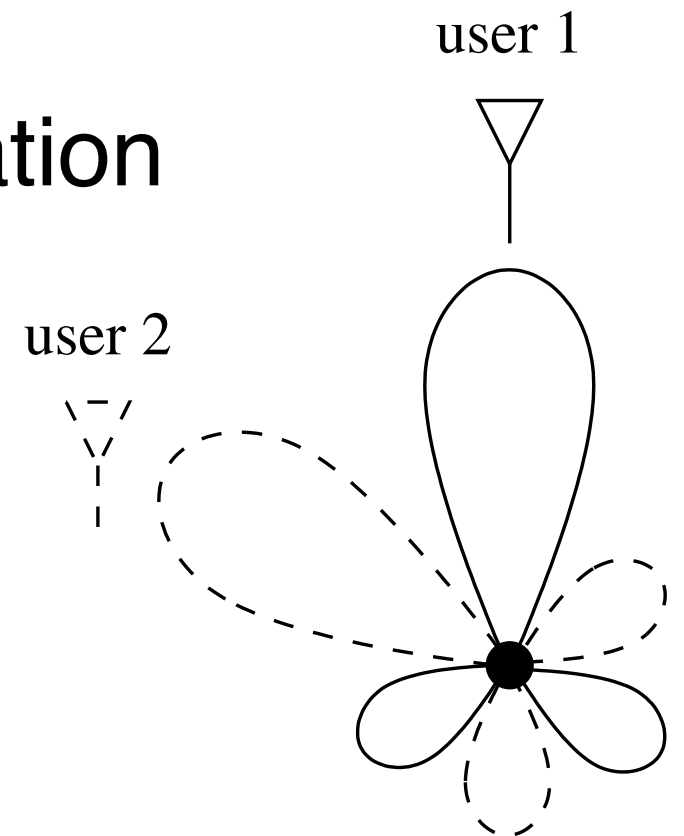


# MIMO Downlink with Fast Fading

- With full CSI one can resort to the uplink-downlink duality to solve the joint optimization problem
- However, with receiver CSI:
  - Not possible for the base station to carry out Tx beamforming
  - In the symmetric downlink channel with CSIR, **time-sharing** is optimal in achieving the capacity region
  - DoF drops significantly from  $\min\{n_t, K\}$  to 1
- Some partial CSI at Tx could recover the spatial DoF:
  - Channel quality of its own link rather than the entire channel
  - No phase information

# Opportunistic Beamforming

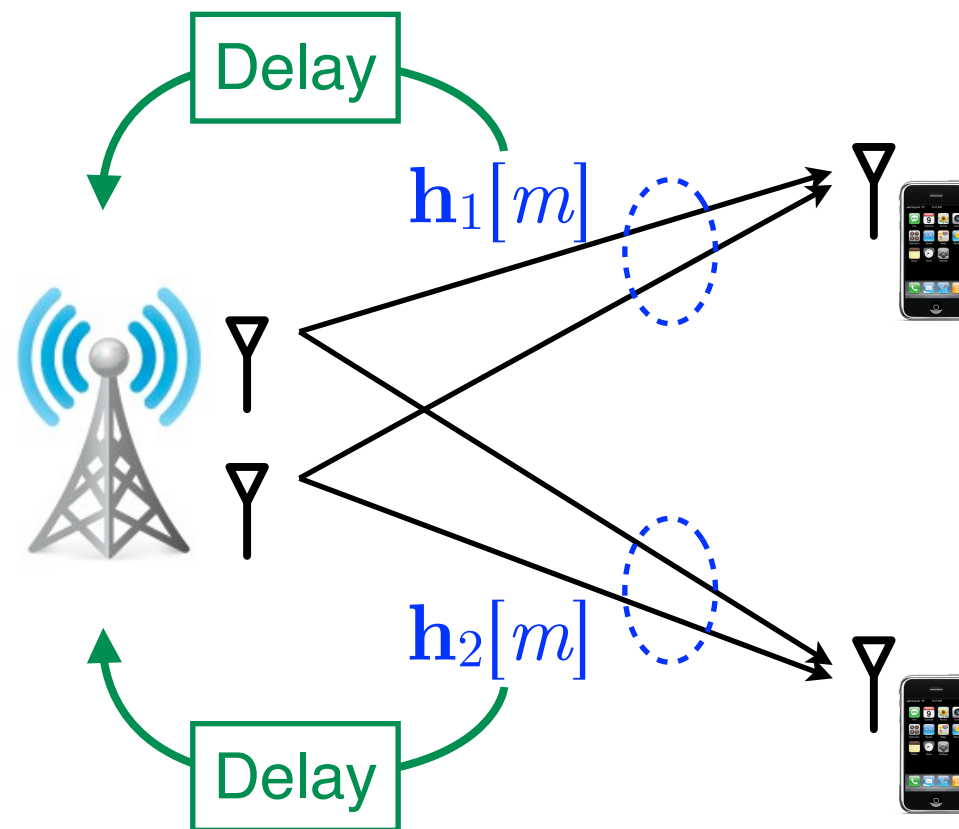
- Opportunistic beamforming with multiple beams:
  - Form  $n_t$  orthogonal beams
  - Whenever a user falls inside the beam, it feedback this piece of information back to the base station
  - As the number of users get large, one is able to find a user in each beam with high probability
- Hence the full DoF could be recovered
- Still, need **instantaneous** channel information



# Transmitter CSI Affects DoF Drastically

- Behaviors of power gain and multiuser diversity gain are similar to those in uplink
- For the downlink MIMO, CSIT is critical for obtaining spatial multiplexing gain (assuming i.i.d. Rayleigh below)
  - Full CSI: Total DoF =  $\min \left\{ \sum_{k=1}^K n_{r,k}, n_t \right\}$
  - CSIR: Total DoF =  $\min \left\{ \max_{k \in [1:K]} n_{r,k}, n_t \right\}$
  - For the case of single-antenna users, DoF with CSIR is merely 1
- Hence it might be beneficial to spend some resource for estimating the channel and predict the current channel from the past observations
- Under i.i.d. Rayleigh, prediction is not possible.
- Question: can past CSI at Tx still help?

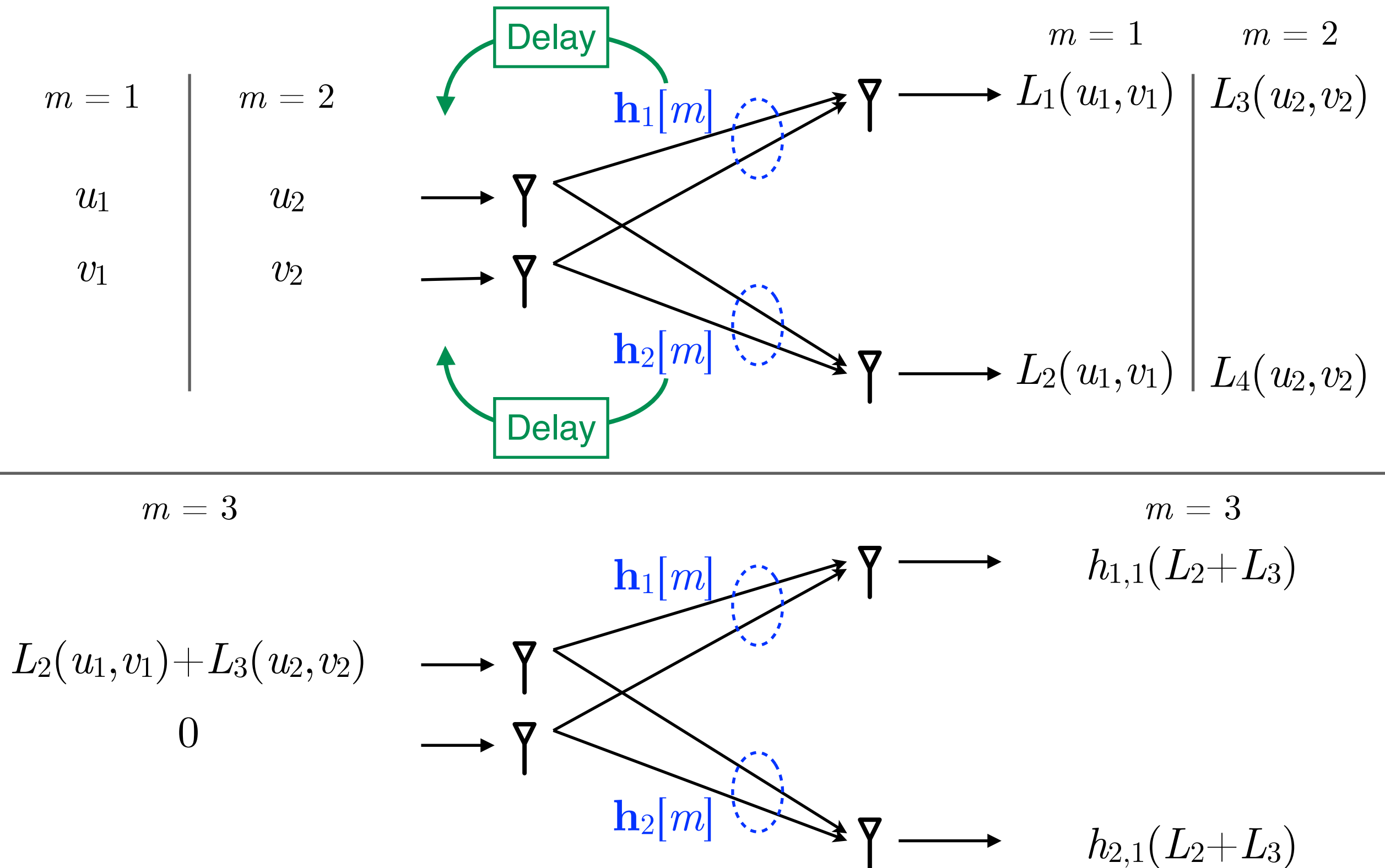
# Two-user MISO Downlink



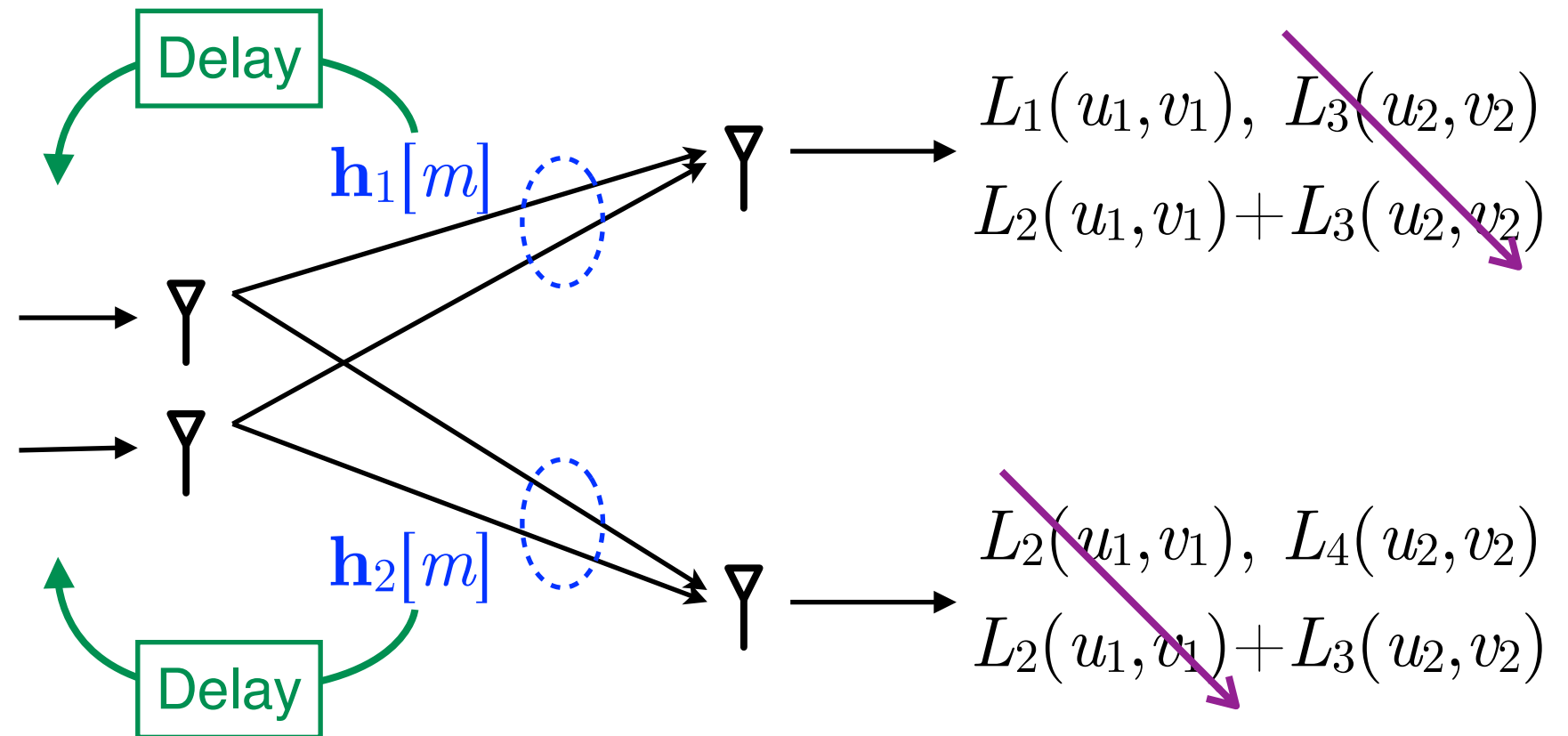
$\mathbf{h}_1[m], \mathbf{h}_2[m] :$   
i.i.d. Rayleigh

- Without transmitter CSI (CSIT), DoF = 1
- With instantaneous CSIT  $\mathbf{H}[m]$  at time  $m$ , DoF = 2
- With delayed CSIT  $\mathbf{H}[1:m-1]$  at time  $m$ , DoF = ?
- Prediction is useless  $\Rightarrow$  delayed CSIT is useless?

# DoF = 4/3 with Delayed CSIT

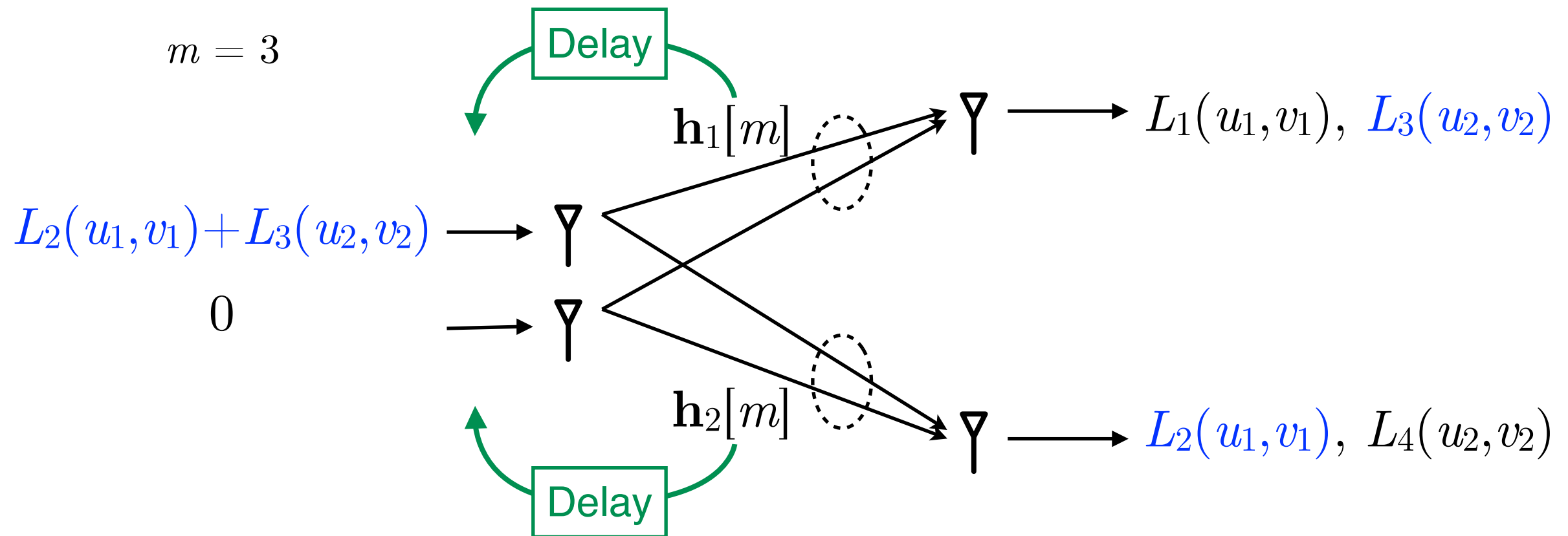


# DoF = 4/3 with Delayed CSIT



- $L_1(u_1, v_1) \nparallel L_2(u_1, v_1)$  &  $L_3(u_2, v_2) \nparallel L_4(u_2, v_2)$  with prob. 1
- Both decode their desired 2 symbols over 3 time slots
- $\text{DoF} = (2+2)/3 = 4/3$

# Exploiting Side Information



- $L_2(u_1, v_1)$  is useful for user 1 but shipped to user 2
- $L_3(u_2, v_2)$  is useful for user 2 but shipped to user 1
- With delayed CSIT, Tx forms  $u_{12} := L_2(u_1, v_1) + L_3(u_2, v_2)$ 
  - User 1 can extract  $L_2$  because it has  $L_3$  as useful side info.
  - User 2 can extract  $L_3$  because it has  $L_2$  as useful side info.

# Hierarchy of Messages

- One can view  $u_{12} := L_2(u_1, v_1) + L_3(u_2, v_2)$  as a common message for both users
- Order-1 message: aimed at only 1 user
  - User 1:  $u_1, v_1$  ; User 2:  $u_2, v_2$
- Order-2 message: aimed at 2 users
  - User  $\{1, 2\}$ :  $u_{12}$
- Define  $\text{DoF}_k :=$  the DoF for sending all order- $k$  messages
- Then we see that

$$\text{DoF}_1 = \frac{4}{2 + \frac{1}{\text{DoF}_2}} = \frac{4}{2 + \frac{1}{1}} = \frac{4}{3}$$



# Two Transmission Phases

- Transmission is divided into two phases
- Phase 1: time  $m = 1, 2$ :
  - Transmit two order-1 messages using two time slots
- End of Phase 1:
  - From the delayed CSI, Tx is able to form one order-2 message
- Phase 2: time  $m = 3$ :
  - Transmit this order-2 message using one time slot
- Only phase 1 sends fresh data; the rest is to refine the reception by exploiting delayed CSIT and Rx side info.
- The idea can be extended to scenarios with more users and more Tx antennas, where higher-order messages have to be formed to achieve optimality

# Optimality of 4/3

- It is remarkable that delayed CSIT is useful and we can achieve  $\text{DoF} = 4/3 > 1$
- Can we do better?
- The answer is **no**

Enhance user 1 by feeding user 2's signal to user 1

Now we have a natural ordering of the users and we find again time-sharing is DoF optimal

$$\text{Hence } d_1 + 2d_2 \leq 2$$

$$\text{Similarly } d_2 + 2d_1 \leq 2$$

$$\Rightarrow 3\text{DoF} \leq 4$$

