

# Coalitions in Cooperative Networks

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# Cooperation and Coalitions

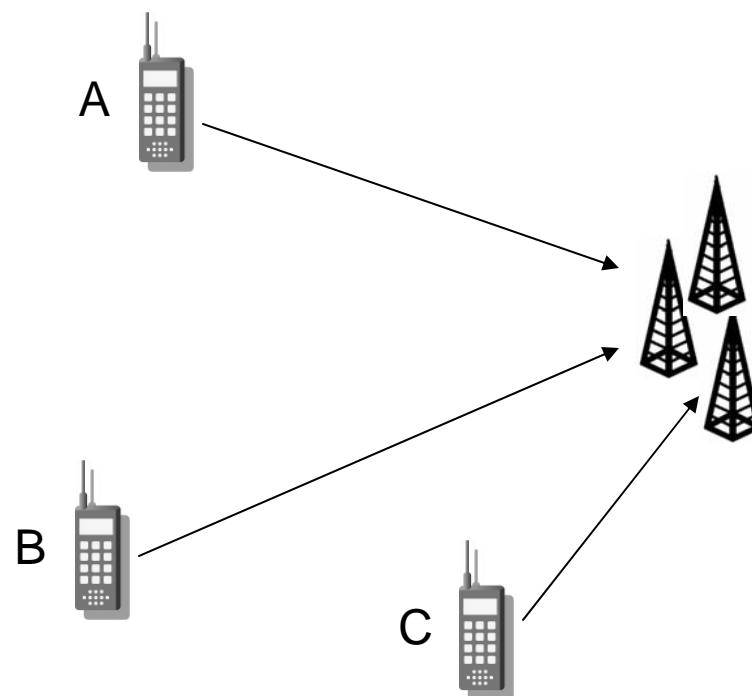
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- Cooperative communications: users share power and bandwidth to mutually enhance transmissions
- Cooperation can achieve rate and diversity (spatial) gains
  - Rate gains from cooperative beamforming
  - When users cooperate, does it always result in gains for each cooperating user?
- Is there value in having all users cooperate?
  - Is it always possible?
  - Will users have incentives to break away (by themselves or as a coalition)?
- Can cooperative protocols induce the formation of disjoint groups of users (coalitions) that are stable?

# Motivation: Example

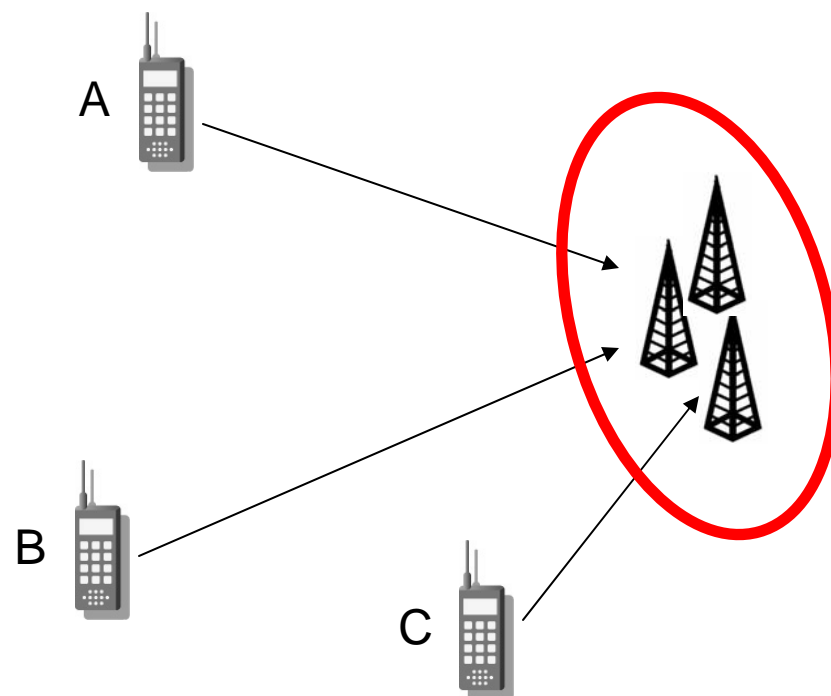
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- 3 users A, B and C communicating with their receivers (assume co-located)
- Receivers cooperate by jointly decoding their received signals.
- Within a coalition, sum-rate achieved is apportioned equally.
- What cooperative behavior emerges? (What coalitions form?)

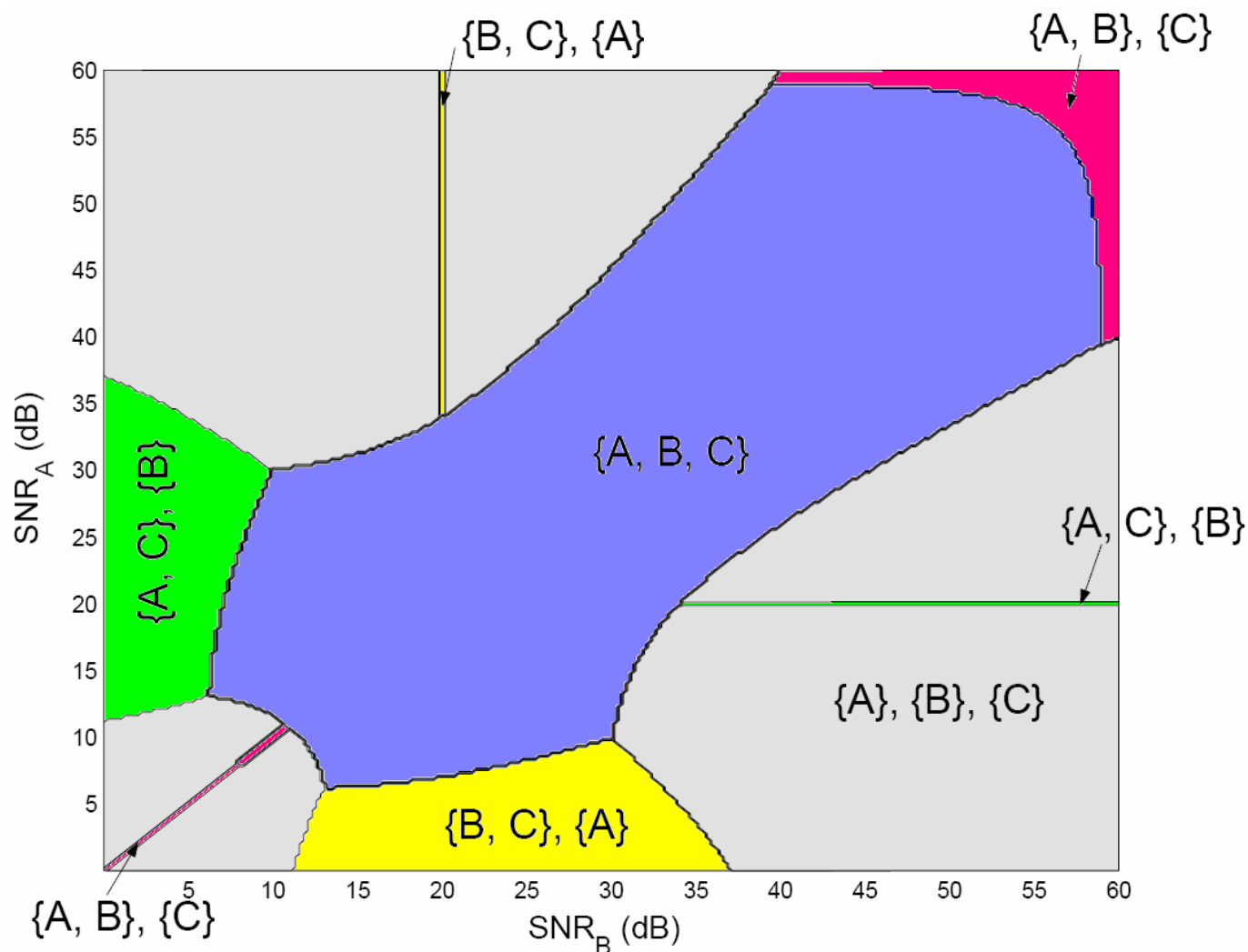


# Motivation: Example

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# Example: Receiver Cooperation



- SNR of user C fixed at 20 dB
- Plot stable coalition structures.
- Equal rate splitting
- Grand coalition is not always stable
- Stable structure depends on apportioning scheme.

# Outline of Talk

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- Use coalitional game theory to determine the stable sum-rate optimal coalition structure
  - Receiver cooperation (joint decoding) in interference channel
  - Rx. cooperation with multiuser detection (MUD) in a MAC.
  - Ideal (noiseless) Tx. cooperation (and perfect Rx. cooperation) in an IC
  - Tx. cooperation via partial decode-and-forward in a MAC.
- Stable coalition: users have no incentives to leave the coalition
- Model utility of a coalition as its information-theoretic achievable sum-rate.
- Focus on the grand coalition (GC) of all users
  - stability depends on cooperative scheme, channel gains, and transmit power

Gaussian MAC [La-Anantharam,IT'2003]; Ad-hoc nets. [Zhu-Poor,2007]

# Coalitional Games - Overview

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- Coalitional games – users cooperate to form coalitions
- Characteristic function form (CFF) games
  - Utility achieved by any coalition is unaffected by the strategy of users outside the coalition
  - Allow tractable analysis of coalitions
  - Receiver coop.: CFF ; transmitter coop: not CFF
- CFF games are of two types
  - *Transferable utility (TU)*: total utility is arbitrarily apportioned between the coalition members subject to feasibility
  - *Non-transferable utility (NTU)*: limited set of allocations
  - TU vs. NTU: single value vs. a set of tuples required to express utility of coalition members

# TU Games - Overview

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- A coalitional game with transferable utility  $\langle \mathcal{K}, v \rangle$ 
  - Finite set of players  $\mathcal{K}$
  - Value function:  $v: \mathcal{S} \rightarrow \mathcal{R}^+ \quad \forall \mathcal{S} \subseteq \mathcal{K}$
- Payoff: share of the value  $v(\mathcal{S})$  to each player.
- Payoff vector: vector of values to players in a coalition
- Number of coalitional structures (set partitions) grow exponentially with number of players
  - Finding the stable structure NP-hard
- Games where grand coalition is stable are tractable and interesting
  - Two properties for GC stability – **cohesive** and **superadditive**



# TU Games – Cohesive Property

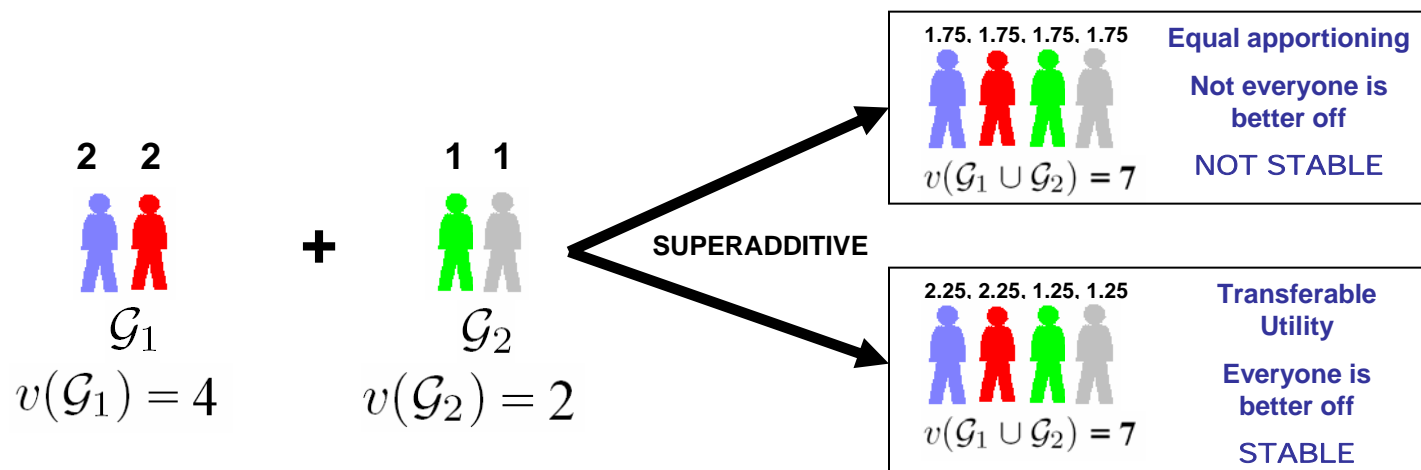
- A TU game is **cohesive** if for any partition  $\{\mathcal{S}_1, \mathcal{S}_2, \dots, \mathcal{S}_N\}$  of  $\mathcal{K}$

$$v(\mathcal{K}) \geq \sum_{n=1}^N v(\mathcal{S}_n)$$

- A TU game is **superadditive** if for disjoint subsets  $\mathcal{G}_1, \mathcal{G}_2$ :

$$v(\mathcal{G}_1 \cup \mathcal{G}_2) \geq v(\mathcal{G}_1) + v(\mathcal{G}_2)$$

- Superadditivity is a stronger condition



# TU Games - Core

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- Core: payoff vectors for coalition structures whose users have no incentives to leave
  - In general, NP-hard to find stable structures
  - Cohesive: grand coalition is the only candidate for the core

- For a cohesive TU game:

$$\mathcal{C}(v) = \left\{ \underset{\downarrow}{x_{\mathcal{K}}} : \sum_{m \in \mathcal{S}} x_m \geq v(\mathcal{S}), \forall \mathcal{S} \subset \mathcal{K} \right\}$$

$|\mathcal{K}|$ -length payoff (utility) vector achieved by the GC

- Existence of empty core  $\equiv$  feasibility of linear program
- Core can be empty  $\rightarrow$  No stable form of cooperation

# Core - Example

---

$$\mathcal{S} = \{1, 2, 3\}$$

$$v(\mathcal{S}) = 1$$

$$v(\{i\}) = 0, \forall i = 1, 2, 3.$$

$$v(\mathcal{G}) = \alpha, \forall |\mathcal{G}| = 2$$

$$0 < \alpha < 1$$

$$R_1 \geq v(\{1\}) = 0$$

$$R_2 \geq v(\{2\}) = 0$$

$$R_3 \geq v(\{3\}) = 0$$

$$R_1 + R_2 \geq v(\{1, 2\}) = \alpha$$

$$R_2 + R_3 \geq v(\{2, 3\}) = \alpha$$

$$R_3 + R_1 \geq v(\{3, 1\}) = \alpha$$

$$R_1 + R_2 + R_3 = v(\mathcal{S}) = 1$$

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*Existence of a non-empty core  $\equiv$  Feasibility of a linear program*

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$$\left\{ \begin{array}{l} R_1 + R_2 \geq v(\{1, 2\}) = \alpha \\ R_2 + R_3 \geq v(\{2, 3\}) = \alpha \\ R_3 + R_1 \geq v(\{3, 1\}) = \alpha \end{array} \right.$$

$$R_1 + R_2 + R_3 = v(\mathcal{S}) = 1$$

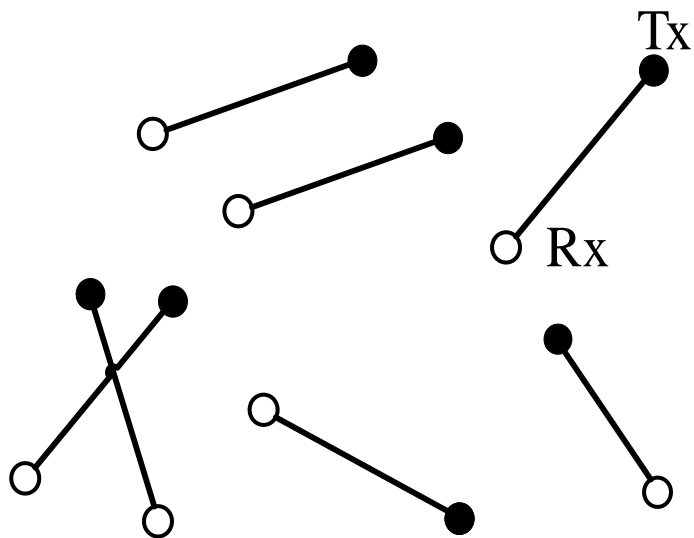
*Existence of a non-empty core  $\equiv$  Feasibility of a linear program  
game is superadditive.*

*core will be non-empty only if  $\alpha \leq \frac{2}{3}$*

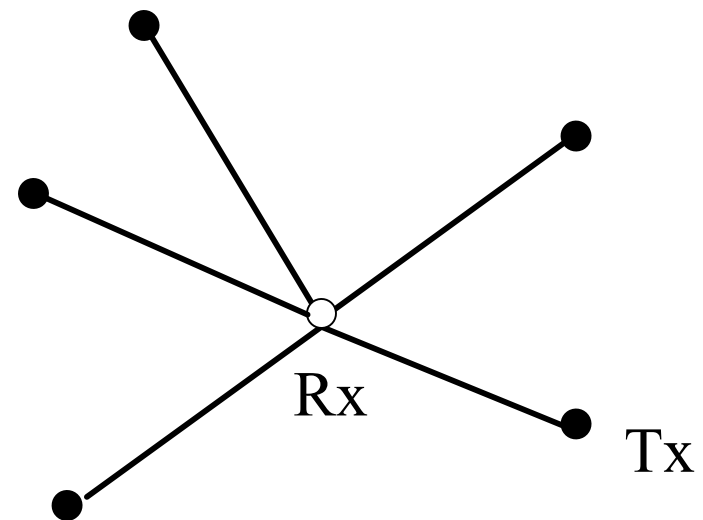
# Cooperative Coalitions in IC & MAC

# Channel Models : IC & MAC

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Interference Channel



Multiaccess Channel

# Channel Models : IC & MAC

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- Additive white Gaussian noise and multiplicative gain
- IC:  $K$  transmit-receive links  $\mathcal{K} = \{1, 2, \dots, K\}$
- $k^{\text{th}}$  link input/output:  $X_k, Y_k$

$$Y_m = \sum_{k=1}^K h_{m,k} X_k + Z_m; \quad Z_m \sim \mathcal{CN}(0,1)$$

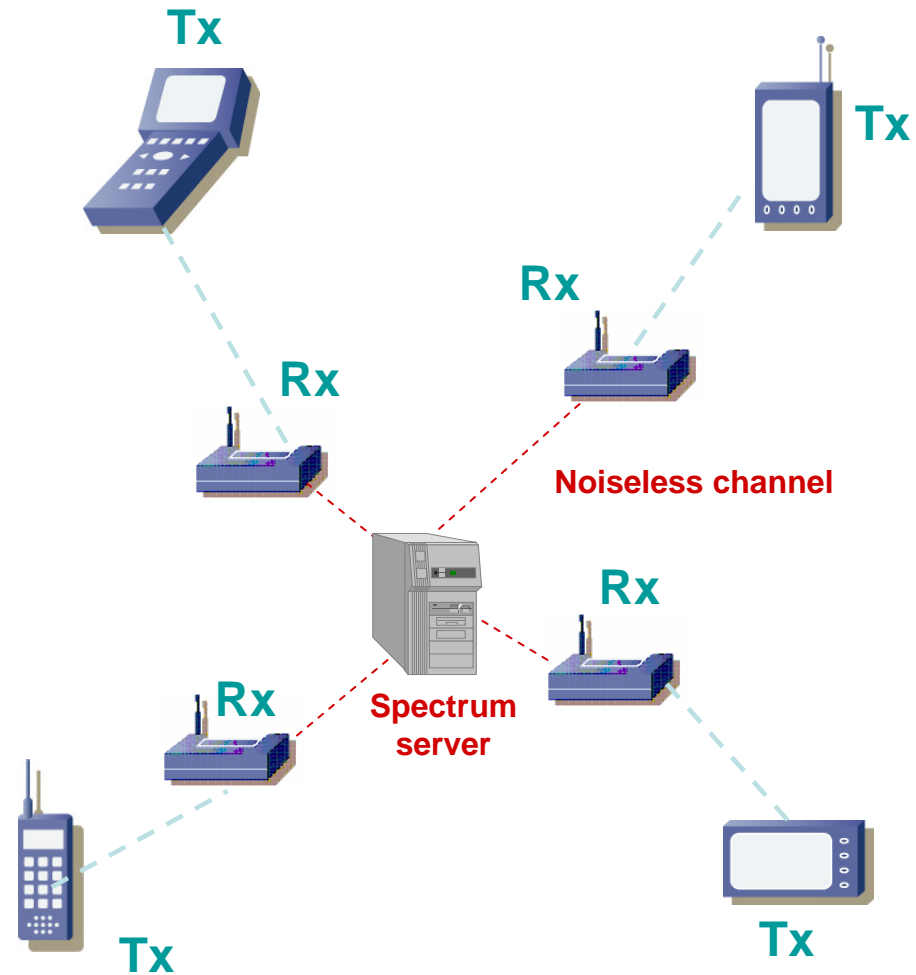
- $h_{m,k}$  : fading gain between  $m^{\text{th}}$  xmitter and  $k^{\text{th}}$  receiver.
- Power constraint at each transmitter:
$$E|X_k|^2 \leq P_k$$
- MAC: All  $K$  transmitters transmit to one receiver.
- Transmitters use Gaussian codebooks
  - Codebook design depends on the cooperation (tx. or rx.) model



# Receiver Cooperation in an IC

# IC: Receiver Cooperation

- Interference Channel (IC): Network of  $K$  transmit-receive links [Carleial, IT-1978]
- When “different” types of devices/networks coexist, Tx cooperation may not always be possible.
  - Rx cooperation more desirable
- Noise-free links with central entity/processor assumed (e.g. spectrum server)



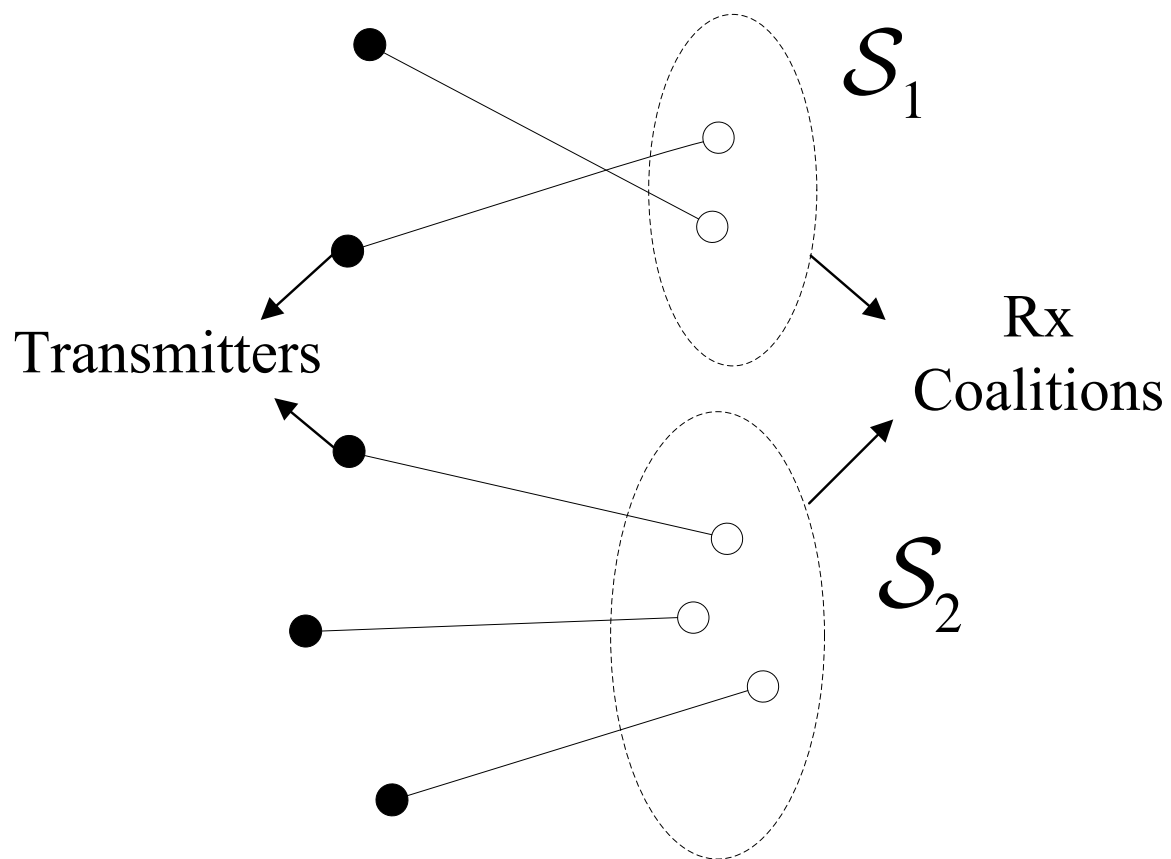
# IC: Rx Cooperation Game

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- Receivers in a coalition jointly decode received signals.
- Model a cooperating coalition of links as a SIMO-MAC
  - Receivers in a coalition behave like a multi-antenna receiver
  - Independent transmitters using Gaussian codebooks
- Signals from links not in coalition treated as interference (noise) by the coalition
  - CFF game as transmitters independent
  - coalition rates independent of transmissions of links outside
- Model as coalitional game with transferable utility.
  - links in a coalition can share the sum rate flexibly.
- What are the optimal & stable coalition structures?

# IC: Rx Cooperation Game

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# IC: Rx Cooperation Game

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- A coalition  $\mathcal{S}$  forms a Gaussian SIMO-MAC with  $|\mathcal{S}|$ -transmitters and a  $|\mathcal{S}|$ -antenna receiver
- $\underline{R}_{\mathcal{S}} = (R_k)_{k \in \mathcal{S}}$  is a vector of rates for links in  $\mathcal{S}$ .
- Value  $v(\mathcal{S})$  : maximum sum-rate achieved by links in  $\mathcal{S}$

$$v(\mathcal{S}) = \max_{\underline{R}_{\mathcal{S}} \in \mathcal{C}_{\mathcal{S}}} \sum_{k \in \mathcal{S}} R_k = I(\mathbf{X}_{\mathcal{S}}; \mathbf{Y}_{\mathcal{S}})$$

- Capacity region  $\mathcal{C}_{\mathcal{S}}$  of a  $|\mathcal{S}|$ -link Gaussian SIMO-MAC

$$\mathcal{C}_{\mathcal{S}} = \left\{ \underline{R}_{\mathcal{S}} : \sum_{k \in \mathcal{A}} R_k \leq I(\mathbf{X}_{\mathcal{A}}; \mathbf{Y}_{\mathcal{S}} | \mathbf{X}_{\mathcal{S} \setminus \mathcal{A}}); \forall \mathcal{A} \subseteq \mathcal{S} \right\}$$

- Dominant face of  $\mathcal{C}_{\mathcal{S}}$  :  $D(\mathcal{S}) = \left\{ \underline{R}_{\mathcal{S}} : \sum_{k \in \mathcal{S}} R_k = v(\mathcal{S}) \right\}$

# IC: Rx Cooperation Game

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- Rx. cooperation game is superadditive
  - follows from properties of mutual information
- TU game – all rate tuples on  $D(\mathcal{S})$  feasible

*Theorem* : The grand coalition (coalition of all links) maximizes spectrum utilization for the receiver cooperation IC coalitional game.

*Theorem* : The core of the receiver cooperation IC coalitional game is non-empty. In fact, every point on the dominant  $D(\mathcal{S})$  of the capacity region  $\mathcal{C}_{\mathcal{K}}$  of the grand coalition belongs to the core.

- Core is non unique
  - fairness of rate vector in the core?

# Fair Rate Allocations

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- With transferable utility, what is a fair allocation of rates to the links?
  - Can we attribute fairness criteria to points on the dominant face?
- Treat as a bargaining problem: two bargaining solutions proposed:
  - Nash bargaining solution (NBS) – gains over direct IC rates
  - Proportional Fairness (PF) solution

# Nash Bargaining Solution (NBS)

- NBS: Maximizes the product of rate gains achieved by each link over its IC rates

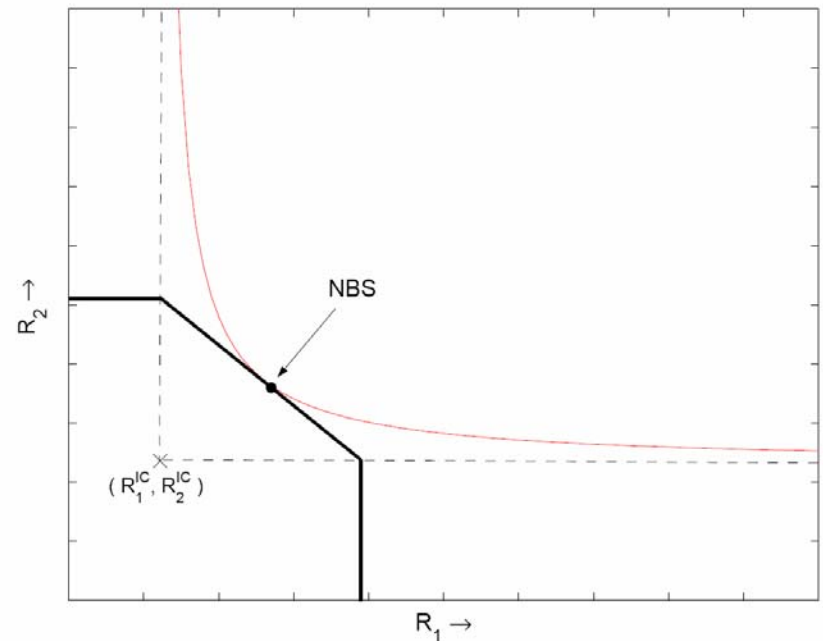
$$\underline{R}_{\mathcal{K}}^{NBS} = \arg \max_{\{R_S: R_k > R_k^{IC}\}} \prod_{k=1}^K (R_k - R_k^{IC}); \quad R_k^{IC} = I(X_k; Y_k)$$

- Properties of NBS:
  - Pareto optimal (max. sum-rate)
  - Symmetric (link label independent)

- Pareto optimality of NBS  $\Rightarrow$

$$\underline{R}_{\mathcal{K}}^{NBS} \in D(\mathcal{K})$$

- Suffices to search for NBS on  $D(\mathcal{K})$





# Proportional Fairness Solution

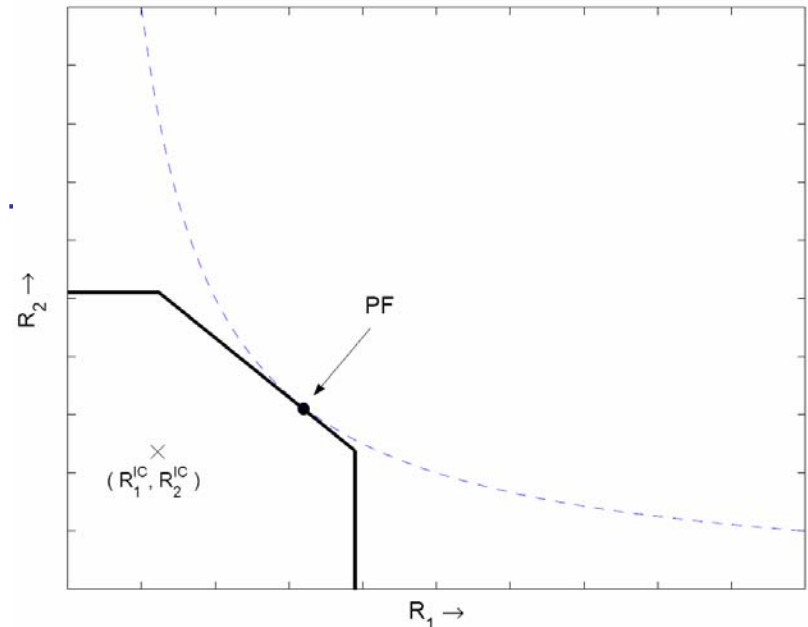
- An allocation of rates is a proportional fair solution *iff*

$$\sum_{k=1}^K (R_k - R_k^{PF}) / R_k^{PF} \leq 0 \Leftrightarrow \arg \max \sum_{k=1}^K \log R_k$$

- For the IC coalitional game,  $\underline{R}_{\mathcal{K}}^{PF}$  simplifies as:

$$\underline{R}_{\mathcal{K}}^{PF} = \arg \max_{\underline{R}_{\mathcal{K}} \in \mathcal{C}_{\mathcal{K}}} \prod_{k=1}^K R_k$$

- PF solution is a special case of NBS
- Suffices to find PF solutions on  $D(\mathcal{K})$



# Rx Game – Illustration of Results

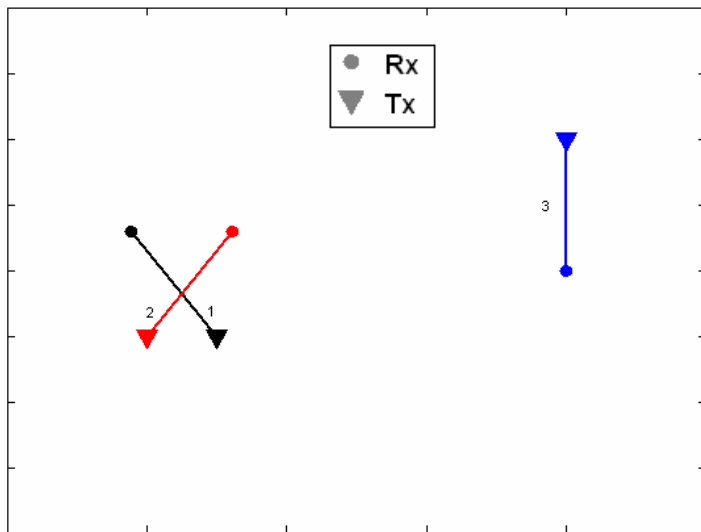
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- Three-link IC with channel gains

$$h_{m,k} = \frac{A_{m,k}}{d_{m,k}^{\alpha/2}}, \quad \forall m, k \in \mathcal{K} = \{1, 2, 3\}, m \neq k$$

- path-loss exponent  $\alpha = 3$
- Consider two network topologies
- For each topology, the transferable utility allocations of NBS and PF presented (GC sum-rate optimal)
- Also consider an equal rate (ER) strategy
  - Non-transferable utility strategy where value  $v(\mathcal{S})$  split equally among the members of  $\mathcal{S}$ .

# Topology 1



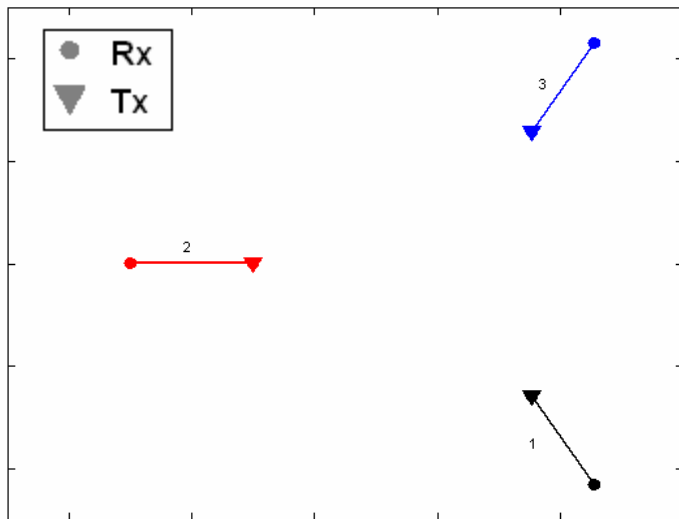
Coalition	$R_1$	$R_2$	$R_3$	Sum-rate
<b>Transferable Utility Allocation Strategies</b>				
$\{1,2,3\}_{\text{NBS}}$	1.4391	1.4346	1.0671	3.9408
$\{1,2,3\}_{\text{PF}}$	1.4372	1.4365	1.0671	3.9408
<b>Non-transferable Utility Allocation Strategy (Equal Rate)</b>				
$\{1,2,3\}$	1.3136	1.3136	1.3136	3.9408
$\{1,2\},\{3\}$	1.4174	1.4174	0.9355	3.7703
$\{2,3\},\{1\}$	0.4170	0.2055	0.2055	0.8280
$\{3,1\},\{2\}$	0.2115	0.4129	0.2115	0.8359
$\{1\},\{2\},\{3\}$	0.4170	0.4129	0.9355	1.7654
<b>Stable ER Coalition: <math>\{1,2\},\{3\}</math></b>				

# Topology 1

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- NBS and PF : different sum-rate maximizing GC allocations
- Equal rate (ER) allocation:
  - GC NOT stable: 1 and 2 achieve better rates via {1,2} coalition though 3 prefers the GC (weak interference case)
  - ER tuple does not lie on  $D(\mathcal{K}) \Rightarrow$  PF is not the equal rate tuple

# Topology 2 (Perfect Symmetry)

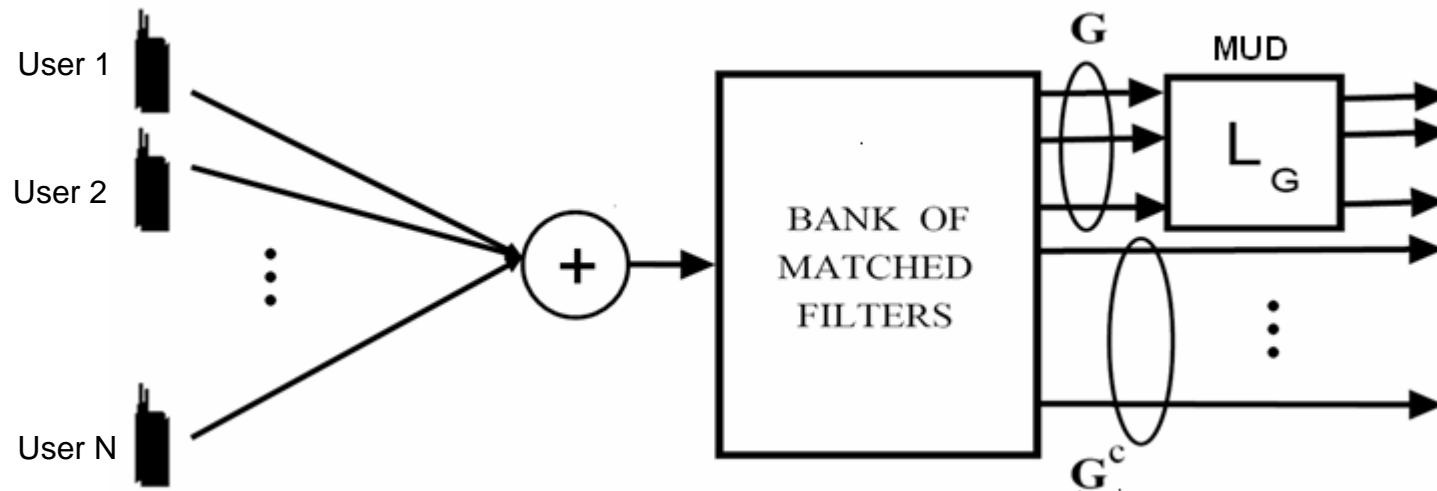


Coalition	$R_1$	$R_2$	$R_3$	Sum-rate
<b>Transferable Utility Allocation Strategies</b>				
$\{1,2,3\}_{\text{NBS}}$	0.9988	0.9988	0.9988	2.9964
$\{1,2,3\}_{\text{PF}}$	0.9988	0.9988	0.9988	2.9964
<b>Non-transferable Utility Allocation Strategy (Equal Rate)</b>				
$\{1,2,3\}$	0.9988	0.9988	0.9988	2.9964
$\{1,2\},\{3\}$	0.9671	0.9671	0.9673	2.9015
$\{2,3\},\{1\}$	0.9673	0.9671	0.9671	2.9015
$\{3,1\},\{2\}$	0.9671	0.9673	0.9671	2.9015
$\{1\},\{2\},\{3\}$	0.9673	0.9673	0.9673	2.9019
<b>Stable ER Coalition: <math>\{1,2,3\}</math></b>				

- NBS, PF and ER lead to identical allocations
  - GC is sum rate maximizing and stable in all three cases

# MAC: Receiver Cooperation via Multiuser Detectors

# MAC : Coalitional Games for Linear MUD



- Linear multiuser detectors for receiver coalitions
- SINR achieved by a user in a coalition is its payoff
- Non-transferable utility game – fixed rates achieved
- Users within a coalition benefit from the interference suppression offered by their MUD

# MMSE and Decorrelating Detector

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- Decorrelating Detector:

*Theorem:* The grand coalition is stable and sum-rate maximizing in the high SNR regime for a decorrelating detector game.

- MMSE:

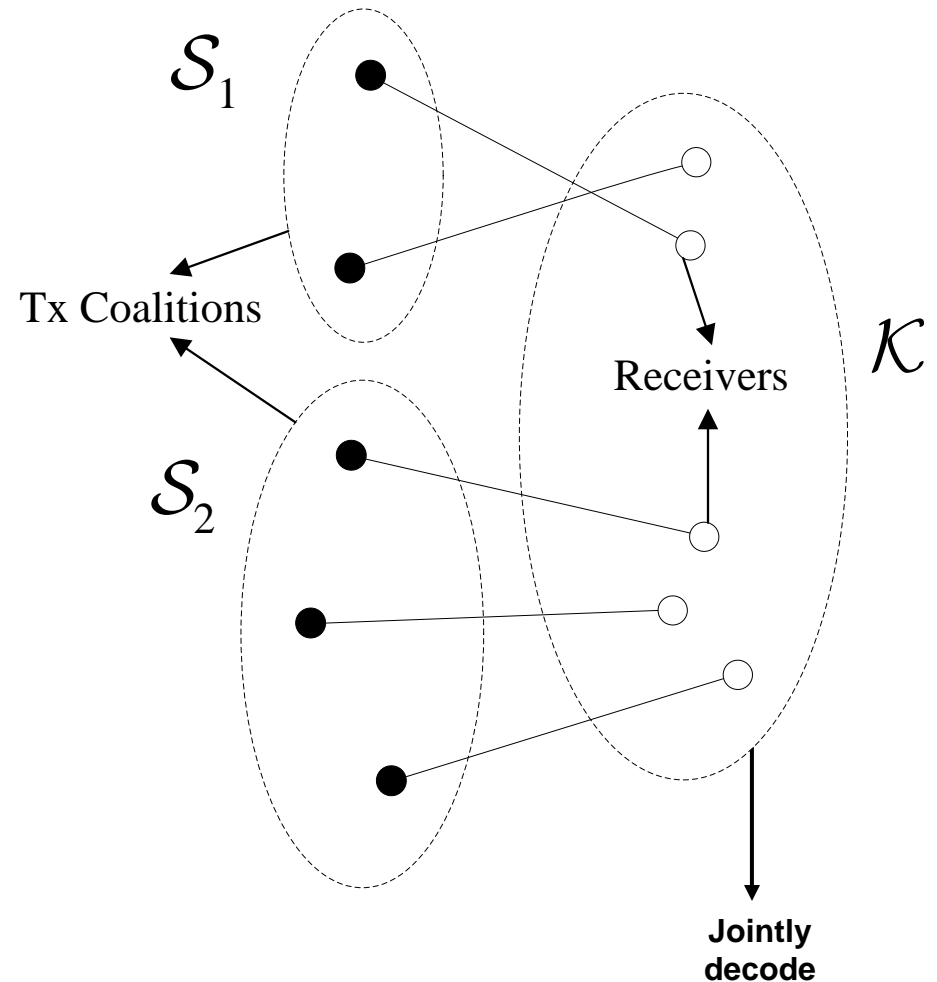
*Theorem:* The grand coalition is always stable and sum-rate maximizing for a MMSE MAC coalitional game.



# IC: Ideal Transmitter Cooperation

# IC: Ideal Transmitter Cooperation

- **Transmitter cooperation:**
  - Through ideal noise-free inter-user links.
  - Cooperating transmitters encode jointly by optimally choosing their transmit covariance matrices.
- **All  $K$  receivers jointly decode their recd. signals**
  - $K$ -antenna receiver
- **Results in a MIMO MAC model**



# IC: Ideal Transmitter Cooperation

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- Collection of  $N$  coalitions modeled as a MIMO-MAC.

$$\underline{Y}_{\mathcal{K}} = \sum_{n=1}^N \underset{\substack{\downarrow \\ K \times |\mathcal{S}_n| \text{ matrix}}}{H_{\mathcal{S}_n}} \underline{X}_{\mathcal{S}_n} + \underline{Z}_{\mathcal{K}}$$

- MIMO-MAC with individual transmit power constraints.
  - Users in coalition  $\mathcal{S}_n$  choose their covariance matrix  $\underline{Q}_{\mathcal{S}_n}$  subject to power constraints.
- Determine:
  - Coalitions that optimize spectrum use (maximize sum-rate)
  - Stable coalitions (belong to the core)

# Transmitter Cooperation: Value

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- The value of a coalition  $\mathcal{S}$  given by the MIMO capacity

$$v(\mathcal{S}) = \max_{Q_{\mathcal{S}}: EX_k^2 \leq P_k} I(X_{\mathcal{S}}; Y_{\mathcal{K}})$$

- Value of coalition  $\mathcal{S}$  depends on the actions of players outside the coalition (interference)
  - Tx cooperation game not of characteristic function form.
  - Difficult to analyze the game in the present form.
- Consider a jamming game
  - A coalition that breaks away experiences worse-case jamming interference from the remaining transmitters
  - Assumption of worst case signaling by non-coalition members
  - Quantifiable lower bound on the payoff of a break-away coalition

# How convert to characteristic form?

---

- Model  $v(\mathcal{S})$  to account for jamming from users in  $\mathcal{S}^c$  as

$$v(\mathcal{S}) = \min_{Q_{\mathcal{S}^c}} \max_{Q_{\mathcal{S}}} \log \left( \frac{|I + H_{\mathcal{S}} Q_{\mathcal{S}} H_{\mathcal{S}}^{\dagger} + H_{\mathcal{S}^c} Q_{\mathcal{S}^c} H_{\mathcal{S}^c}^{\dagger}|}{|I + H_{\mathcal{S}^c} Q_{\mathcal{S}^c} H_{\mathcal{S}^c}^{\dagger}|} \right)$$

*s.t.*  $EX_k^2 \leq P_k$

- A min-max optimization problem.
- Models a two-player mutual information game between coalitions  $\mathcal{S}$  and  $\mathcal{S}^c$ .
- Saddle point in the mutual-information game between  $\mathcal{S}$  and  $\mathcal{S}^c$  [Diggavi & Cover, IT-2001]
  - $v(\mathcal{S})$  concave in  $Q_{\mathcal{S}}$  and convex in  $Q_{\mathcal{S}^c}$

# IC: Tx. Cooperation Game

---

- Tx. Coop. game is cohesive (saddle point property).
- Game has TU (sum-rate = virtual MIMO capacity)
  - grand coalition is the only candidate for the core.
- Existence of a non-empty core?
  - Show existence of stable rate tuples
  - Analytical proof of stability difficult as stability requires comparing high-dimensional rate regions
- Counter examples show that the grand coalition cannot always guaranteed to be stable.
  - Indicates channel and power ranges for which a non-empty core can result

# Tx. Cooperation: Example 1

- IC with 3 Tx – Rx links and  $P_k = 1$  for all  $k$

$$\mathbf{H} = \begin{pmatrix} 0.3019 & 0.3772 & 1.8021 \times 10^{-2} \\ 2.6256 \times 10^{-8} & 3.1413 \times 10^{-5} & 2.5662 \times 10^{-5} \\ 2.6893 \times 10^{-6} & 1.9941 \times 10^{-3} & 0.8502 \end{pmatrix} \begin{matrix} \leftarrow \text{Rx 1} \\ \leftarrow \text{Rx 2} \\ \leftarrow \text{Rx 3} \end{matrix}$$

$\begin{matrix} \uparrow & \uparrow & \uparrow \\ \text{Tx 1} & \text{Tx 2} & \text{Tx 3} \end{matrix}$

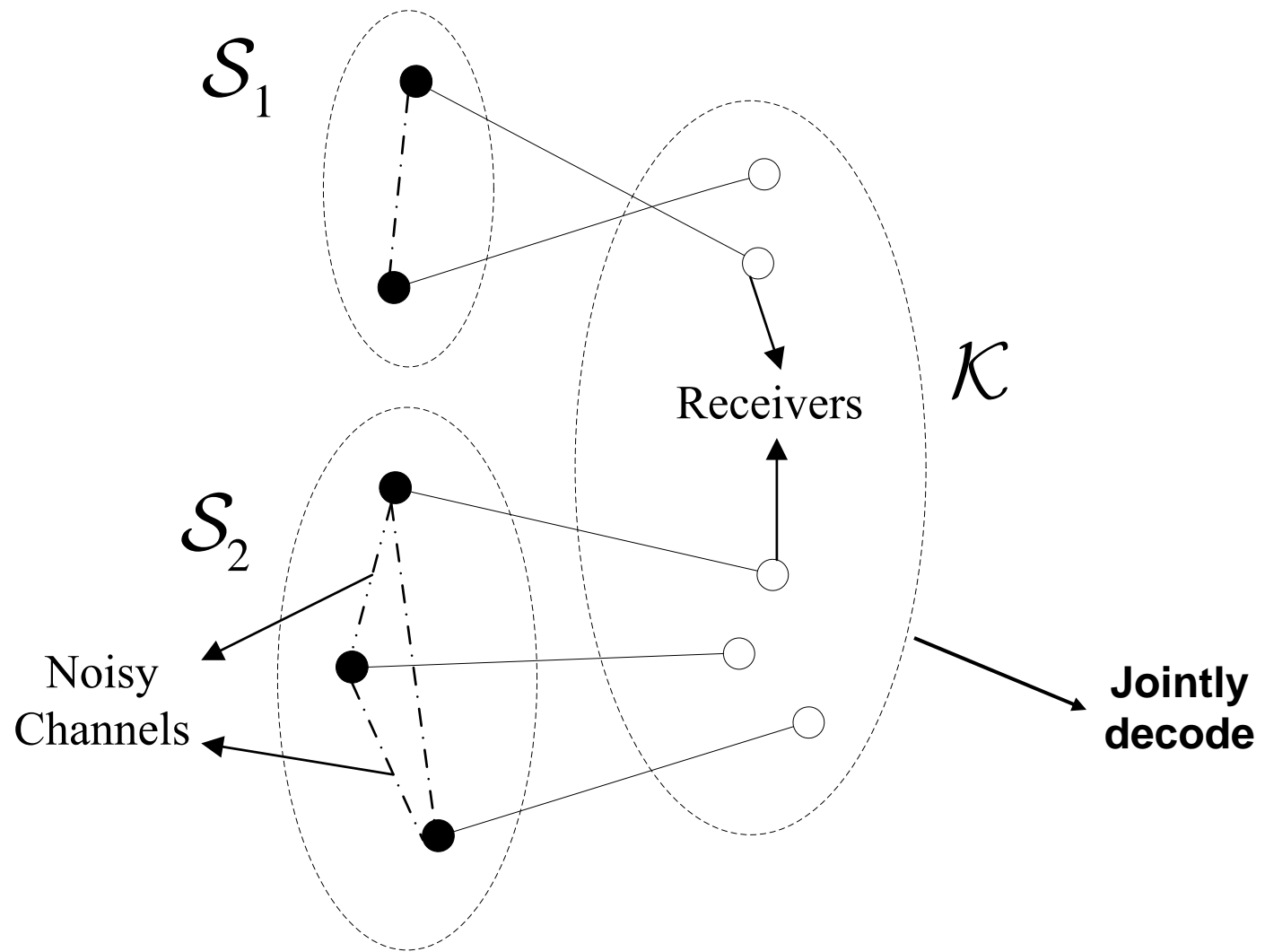
- All direct channels are strongest except for link 2
  - Link 3 has very little interference from links 1 and 2
  - Link 1 has significant interference from user 2
- Recall: Existence of a non-empty core  $\equiv$  feasibility of a LP.
  - Infeasibility  $\Rightarrow$  Empty core  $\Rightarrow$  grand coalition not stable.
  - No stable coalition exists.
    - Conjecture: non-empty core when all transmitters have comparable channel gains and transmit powers

# MAC: Transmitter Cooperation via Partial Decode-and-Forward (PDF)



# MAC: Partial Decode-and-Forward

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# MAC: Noisy Inter-User Links

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- IC with perfect inter-user links: core is not guaranteed to be non-empty
  - Despite game being cohesive (GC is sum-rate optimal)
- Will relaxing the assumption of noise-free inter-user links change the stability of the core?
  - Consider a  $K$ -user MAC
  - Users decode-and-forward messages over noisy inter-user links
  - Model as a MAC with generalized feedback (MAC-GF) [Willems, IT'82] (full-duplex model)
  - $K$ -user generalization assuming all users cooperate [Sankar, Kramer, Mandayam, ISIT'05]

[Sendonaris, Erkip, Aazhang, 2002]

# MAC: Tx. Coop. Channel Model

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- Consider a  $K$ -user clustered model
  - Inter-user channels stronger than user-destination channel
  - Simplest relaxation of the noise-free inter-user links assumption
  - Users more likely to cooperate to overcome poor direct channel

- Channel model for a coalition structure  $\{\mathcal{S}_1, \mathcal{S}_2, \dots, \mathcal{S}_N\}$

$$Y_d = \sum_{n=1}^N h_{s_n} X_{s_n} + Z_d$$

- Clustered model:

$$|h_{m,k}| > |h_{d,k}| \quad \forall m, k \in \mathcal{K}$$

# MAC: Partial Decode-and-Forward

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- Transmitter cooperation:
  - Cooperating transmitter  $k$  splits power  $P_k$  between private, common, and cooperative messages as  $(P_{k,d}, P_{k,c}, P_{k,u})$
  - Cooperating transmitters decode only common message
  - Destination decodes all messages
  
- PDF transmitter cooperation is not in characteristic function form (CFF)
  - rates achieved by a coalition are not independent of transmit strategies of users outside
  - Assume worst case jamming interference for a coalition that breaks away
  - Simplifies game to CFF form and allows tractable analysis

# MAC: Partial Decode-and-Forward

---

- PDF Rate region for coalition  $\mathcal{S}$  :

$$\mathcal{R}_{\mathcal{S}}^{PDF} = \text{co} \left( \bigcup_{\underline{P}} \mathcal{R}_{\mathcal{S}}(\underline{P}) \right) ; \underline{P} = (P_{k,d}, P_{k,c}, P_{k,u})_{k \in \mathcal{S}}$$

- $\mathcal{R}_{\mathcal{S}}(\underline{P})$  is the PDF rate region achieved by a specific allocation vector  $\underline{P}$  at all users.
- Each rate tuple on the hull achieved with different  $\underline{P}$ 
  - Non-transferrable utility game – use a set of rate tuples (region) to characterize the value set  $\mathcal{V}(\mathcal{S})$  of a coalition  $\mathcal{S}$
  - To evaluate value need to determine the boundary of PDF region

# PDF: Optimal Power Allocation

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- What power allocations maximize regions  $\mathcal{R}_S^{PDF}$  for all  $\mathcal{S}$ ?
- Two-user MAC-GF: [Kaya, Ulukus, TW-2007]
  - For a fixed  $P_{k,u}$  (power for cooperation), user  $k$  ( $=1,2$ ) allocates the remaining power to the better channel (direct or inter-user)
  - sets either  $P_{k,d}$  or  $P_{k,c}$  to zero, i.e., either common or private message
- For a  $K$ -user clustered MAC-GF:

*Theorem:* The optimal power allocation for  $K$  clustered users is  $P_{k,d} = 0$  and  $P_{k,c} = P_k - P_{k,u}$ .

- Every rate tuple on the boundary is maximized when no private messages are sent (cooperating users decode all messages).

# PDF Game: GC and Stability

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- Is the NTU PDF game cohesive – are the rate regions of all other coalitions a subset of the GC region  $\mathcal{R}_{\mathcal{K}}^{PDF}$ ?
- NTU game: value  $\mathcal{V}(\mathcal{S})$  is the set of all rate vectors achieved by  $\mathcal{S}$
- NTU game is cohesive when

$$\bigcap_{n=1}^N \mathcal{V}(\mathcal{S}_n) \subseteq \mathcal{V}(\mathcal{K})$$

- Core: no coalition  $\mathcal{S} \subset \mathcal{K}$  achieves rate tuples that lie on or outside the GC rate region
- Proving cohesiveness not straightforward
  - Provide counter-example

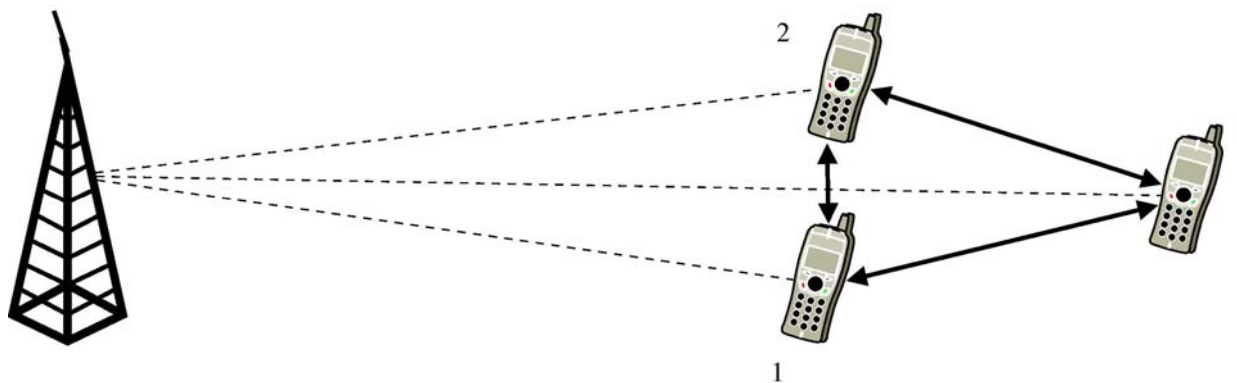
# PDF Game: Example

- Three-user MAC with

$$\begin{array}{ll} h_{d,1} = h_{d,2} = 0.05 & h_{d,3} = 0.025 \\ h_{1,2} = h_{2,1} = 1 & h_{1,3} = h_{3,1} = h_{2,3} = h_{3,2} = 0.1 \end{array}$$

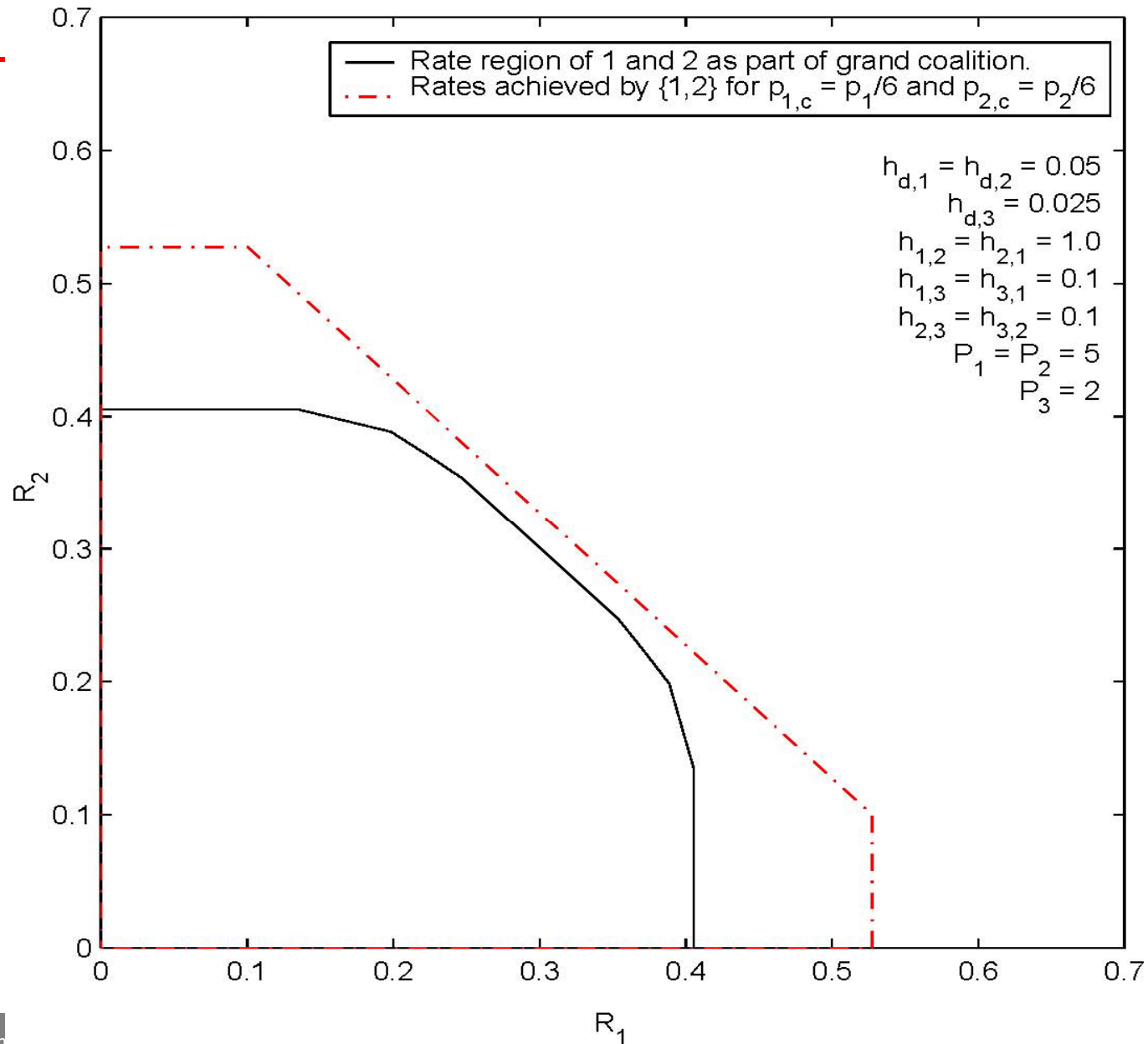
and  $P_1 = P_2 = 5$  and  $P_3 = 2$ .

- Users 1,2 : strong inter-user channel and user 3 smaller transmit power





# PDF Game: Example



# Conclusions

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- Cooperation in wireless networks can be studied using coalitional game theory.
- GC is the only candidate for the core in cohesive games.
- Ideal receiver cooperation is guaranteed to have a non-empty core.
  - bargaining theory can be used for ‘fair’ allocations.
- A non-empty core cannot be guaranteed for transmitter cooperation in general.
- Cohesiveness and stability depends on incentives and disincentives for cooperation
  - Noise enhancement in decorrelating detectors in low SNR regime
  - Channel gains and weak jammers in ideal tx. cooperation game
  - And noisy inter-user links in tx. PDF game

# Related Papers

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- S. Mathur, L. Sankar, N. Mandayam, “Coalitions in Cooperative Wireless Networks”, submitted to IEEE JSAC.
- S. Mathur, L. Sankar., N. Mandayam, “Coalitional Games in Gaussian Interference Channels”, Proc. IEEE ISIT, 2006.
- S. Mathur, L. Sankar., N. Mandayam, “Coalitional Games in Receiver Cooperation for Spectrum Sharing”, Proc. CISS 2006.
- S. Mathur, “Coalitional Games in Cooperative Networks”, MS Thesis. <http://www.winlab.rutgers.edu/~suhas>

Thank you