

# Gaussian many-to-one channels

## Some sum capacity results<sup>1</sup>

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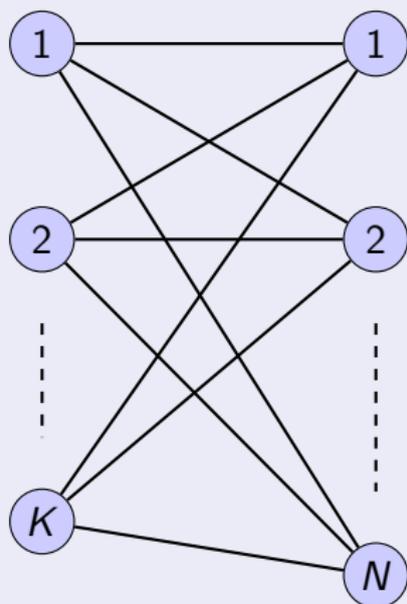
January 1, 2016

Joint work with Ranga Prasad and A. Chockalingam (IISc)

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<sup>1</sup>R. Prasad, S. Bhashyam, A. Chockalingam, "On the Gaussian Many-to-One X Channel,"  
IEEE Transactions on Information Theory, vol. 62, no. 1, pp. 244-259, January 2016.

# Single-hop Interference Network [Carleial '78]



- $K$  transmitters,  $N$  receivers, single-hop
- Possible message from each transmitter to each subset of receivers

$K(2^N - 1)$  possible messages

# Single-hop interference networks: Two special cases

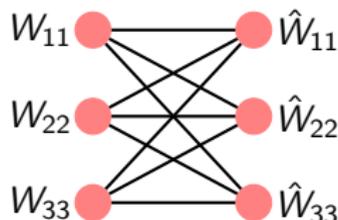
$K \times N$  Interference network

Interference channel (IC)

X channel (XC)

$K$ -user IC

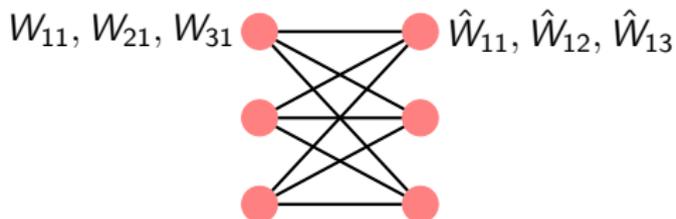
- $K$  distinct Tx-Rx pairs,  $K$  messages
- $K(K - 1)$  interfering links



3-user IC

$K \times N$  XC

- Message for each link
- $KN$  messages



$3 \times 3$  XC

# Gaussian interference channel: Some known results

## 2-user IC

- Capacity
  - ▶ Strong interference [Carleial75, HanKob81, Sato81]
- Sum capacity
  - ▶ Mixed interference [MotKha09]
  - ▶ Noisy interference [AnnVee09, MotKha09, ShaKraChe09]

## K-user IC

- Sum capacity: Noisy interference [ShaKraChe09, AnnVee09]
- Capacity region: Symmetric very strong interference [SriJafVisJaf08]

## K-user Many-to-one IC

- Sum capacity: Noisy interference [CadJaf09, AnnVee09]
- Capacity region: Symmetric very strong interference [ZhuGas15]
- Special case ( $K = 2$ ): One-sided IC / Z-IC [Sason04]
- This talk (Sum capacity)

# Gaussian X channel: Some known results

## $2 \times 2$ XC

- Sum capacity: Noisy interference [HuaCadJaf12]

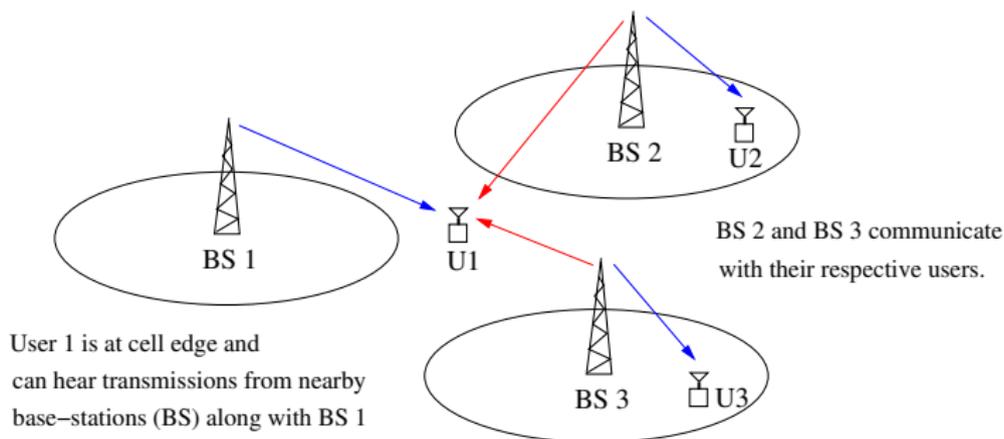
## $K \times K$ Many-to-one XC

- Special case ( $K = 2$ ): ZC
  - ▶ Sum capacity: Weak interference [LiuUlu04]
  - ▶ Sum capacity: Strong interference [ChoMotGar07]
  - ▶ Capacity region: Moderately strong interference [ChoMotGar07]
- This talk (Sum capacity)

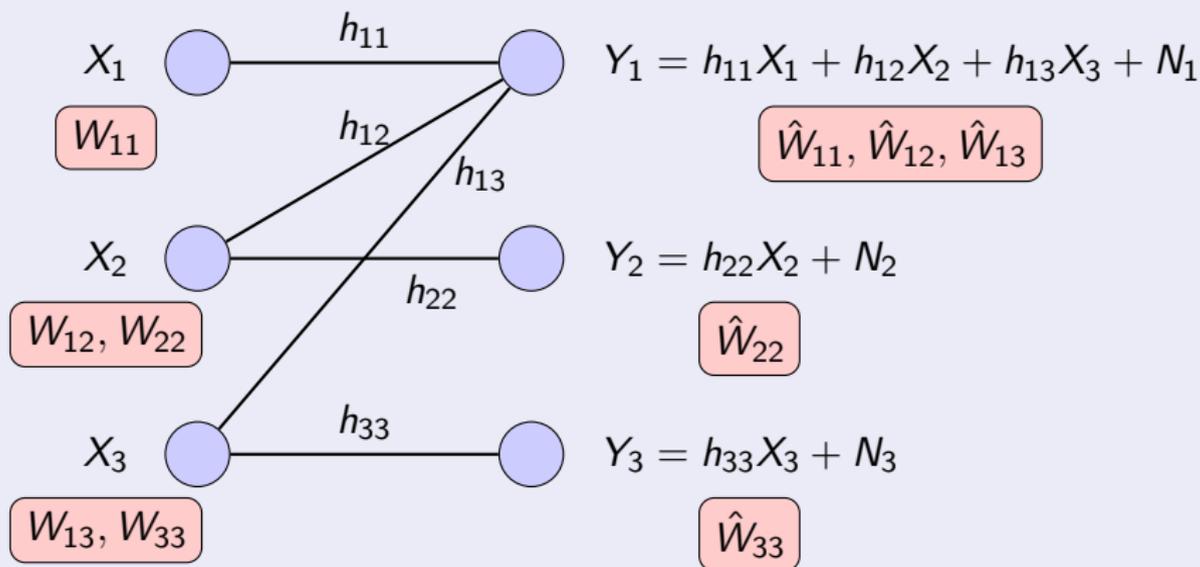
# Gaussian many-to-one channels

# Many-to-one Channels: Motivation

- Captures some essential features (interference), easier for analysis
- Results can be used to find bounds for more general topologies
  - ▶ Bounds for 2-user IC using one-sided IC
- Approximation to a possible real scenario



## $3 \times 3$ Gaussian many-to-one X channel

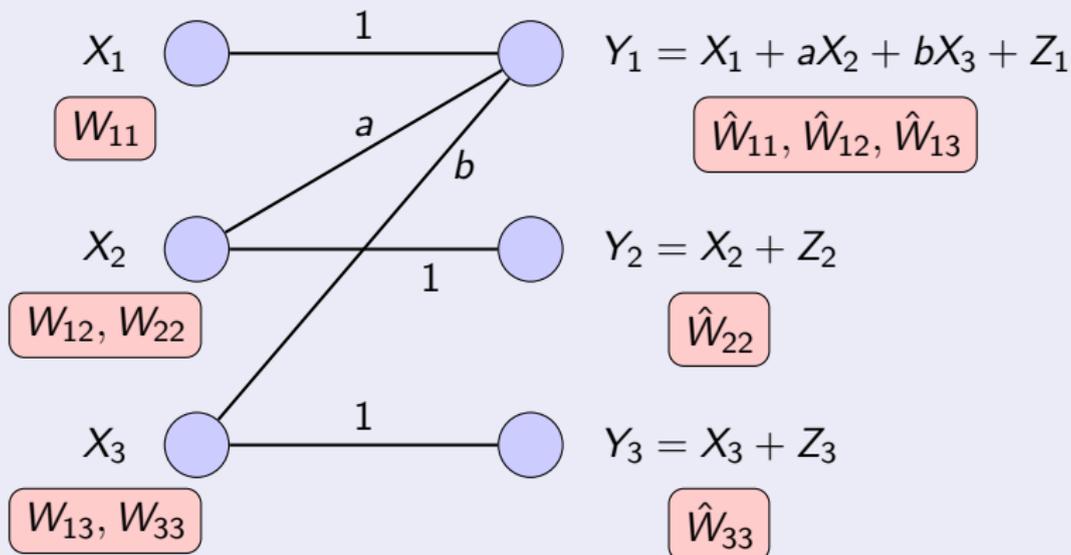


Capacity region (5-dimensional) not easy to characterize

- One flow on each link ( $R_{ij}$ : Rate from Tx  $j$  to Rx  $i$ )
- $\mathcal{C}$  = Set of all achievable  $\mathbf{R} = (R_{11}, R_{22}, R_{12}, R_{33}, R_{13})$
- This talk: sum capacity

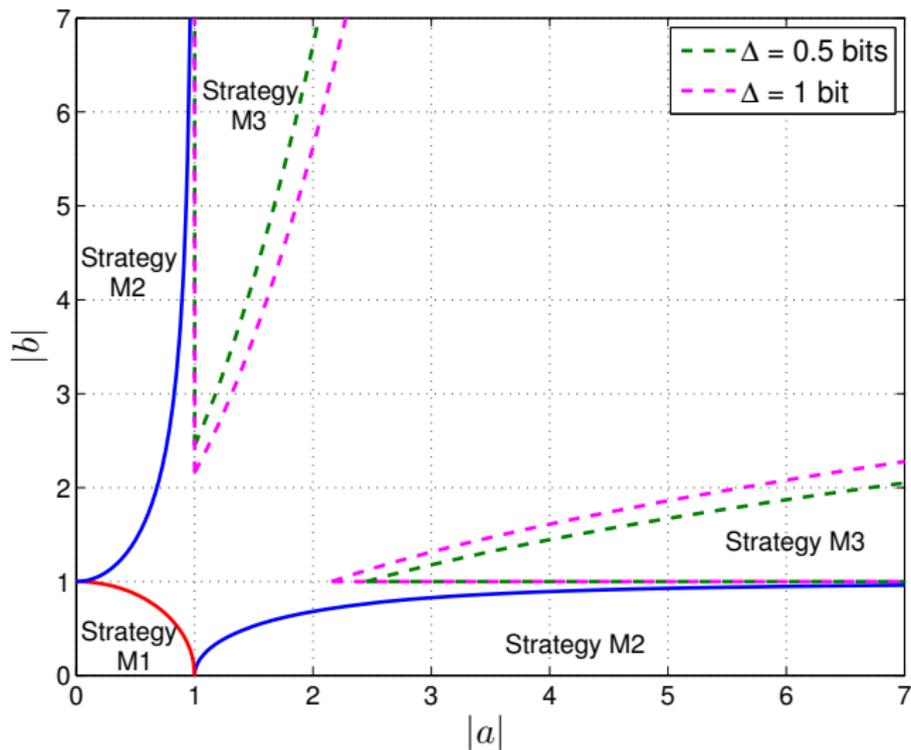
## Channel in standard form

Reduce the number of parameters required



- $\mathcal{C}(\mathbf{P}', \mathbf{h}, \mathbf{N}) = \mathcal{C}_{standard}(\mathbf{P}, a, b)$
- $Z_i$  IID  $\sim N(0, 1)$ ,  $\mathbf{P}, \mathbf{P}'$ : power constraints,  $\mathbf{N}$ : noise variance vector

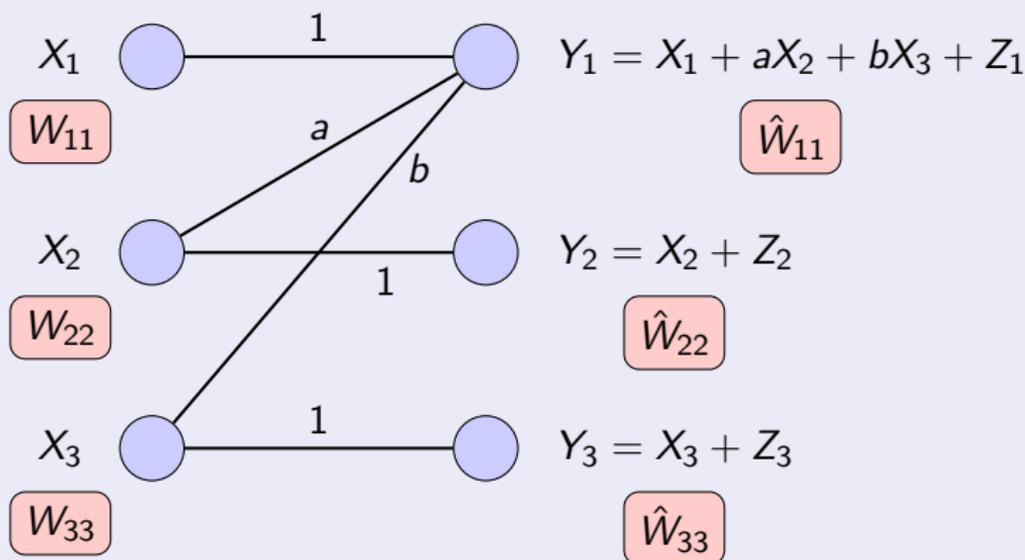
# Result for the $3 \times 3$ many-to-one XC



$$P_1 = P_2 = P_3 = 0\text{dB}$$

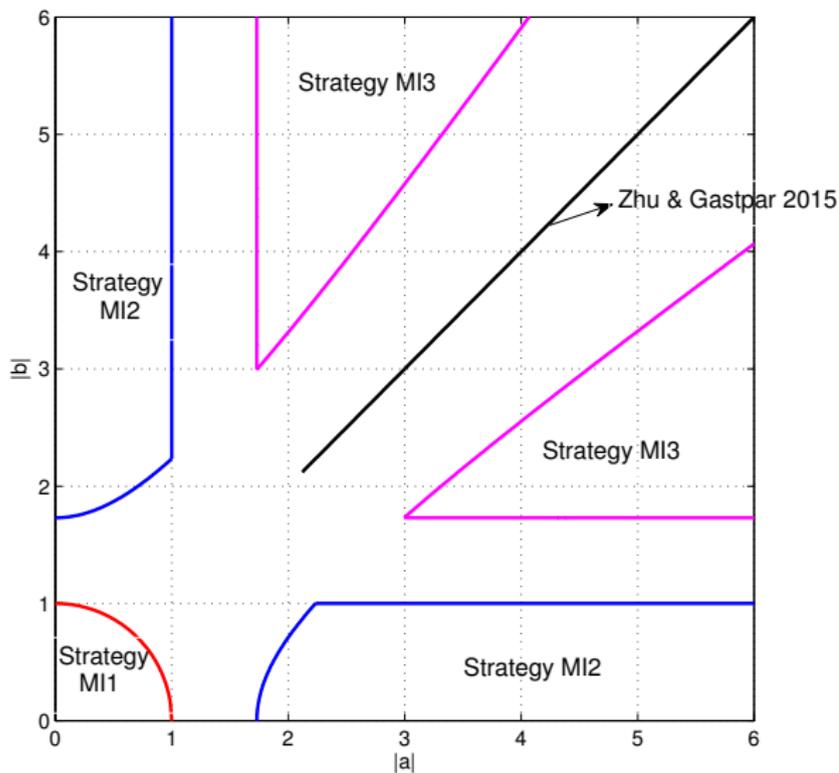
# Many-to-one IC

A special case of the many-to-one XC



- Sum capacity: Noisy interference Annappureddy & Veeravalli 2009, Cadambe & Jafar 2009
- Capacity: Symmetric very strong interference Zhu & Gastpar 2015
- Capacity within a constant gap Bresler, Parekh & Tse 2010, Jovicic, Wang, & Viswanath 2010

# Result for the $3 \times 3$ many-to-one IC



$$P_1 = P_2 = P_3 = 3\text{dB}$$

# Rest of this talk

## $3 \times 3$ Many-to-one XC

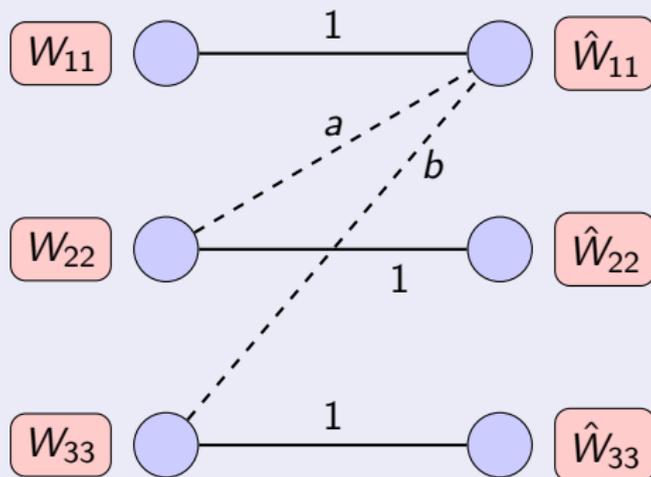
- Transmission strategies for the many-to-one XC
  - ▶ Treat interference from a **subset** of transmitters as noise
  - ▶ Use of Gaussian codebooks
- Conditions for sum rate optimality

## Extensions to $K \times K$ Many-to-one XC

## $K \times K$ Many-to-one IC

# Gaussian $3 \times 3$ many-to-one XC

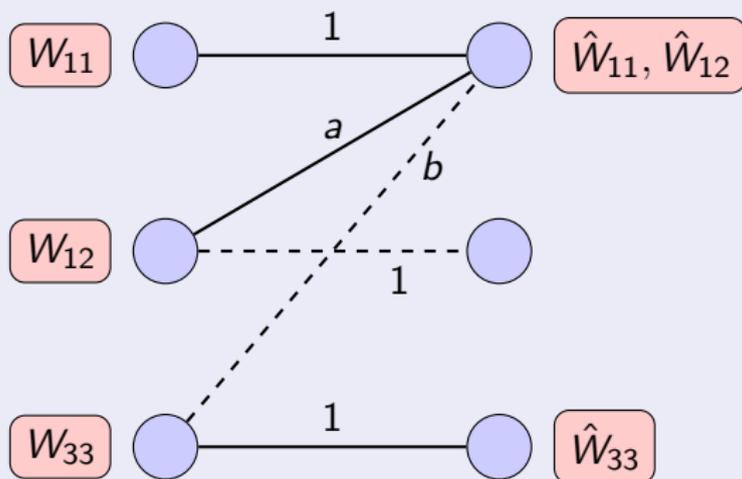
## Strategy M1: Treating Interference as Noise (TIN)



Achieved sum-rate

$$R_{sum} = \frac{1}{2} \log_2 \left( 1 + \frac{P_1}{a^2 P_2 + b^2 P_3 + 1} \right) + \frac{1}{2} \log_2 (1 + P_2) + \frac{1}{2} \log_2 (1 + P_3)$$

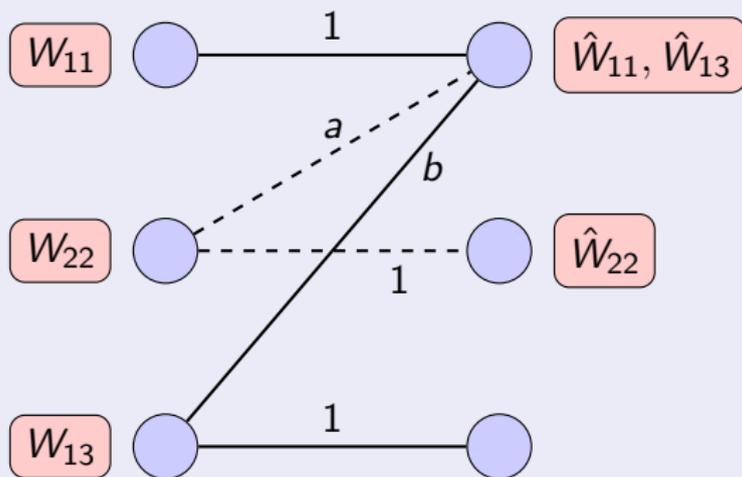
## Strategy M2



Achieved sum-rate

$$R_{sum} = \frac{1}{2} \log_2 \left( 1 + \frac{P_1 + a^2 P_2}{b^2 P_3 + 1} \right) + \frac{1}{2} \log_2 (1 + P_3)$$

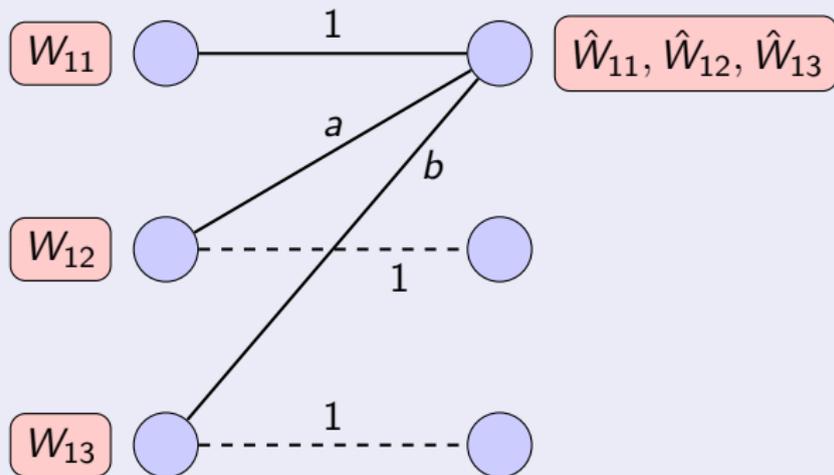
## Strategy M2



Achieved sum-rate

$$R_{sum} = \frac{1}{2} \log_2 \left( 1 + \frac{P_1 + b^2 P_3}{a^2 P_2 + 1} \right) + \frac{1}{2} \log_2 (1 + P_2)$$

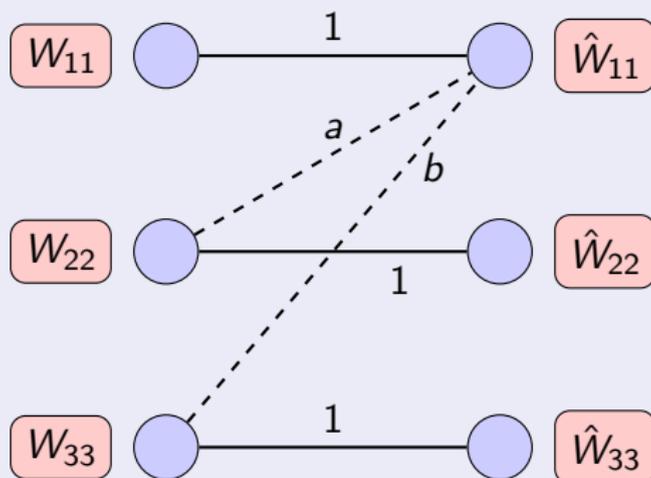
## Strategy M3



Achieved sum-rate

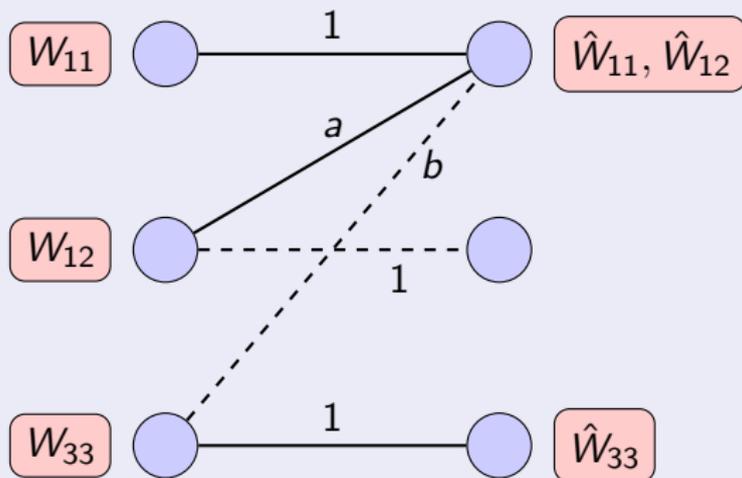
$$R_{sum} = \frac{1}{2} \log_2 (1 + P_1 + a^2 P_2 + b^2 P_3)$$

# Sum-rate optimality of Strategy M1 (TIN)



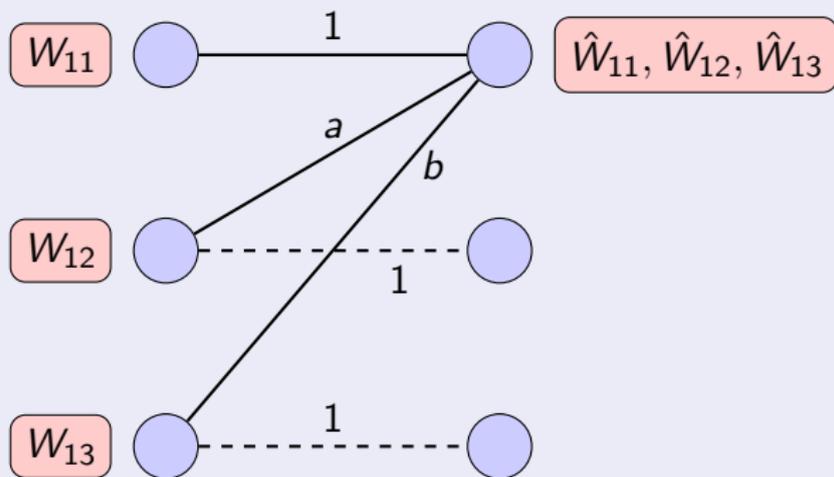
Strategy M1 achieves sum capacity if  $a^2 + b^2 \leq 1$

## Sum-rate optimality of Strategy M2



Strategy M2 achieves sum capacity if  $b^2 < 1$  and  $a^2 \geq \frac{(1+b^2P_3)^2}{1-b^2}$

## Approximate sum-rate optimality of Strategy M3



Strategy M3 achieves rates within

$$\frac{1}{2} \log_2 \left( \frac{1 - (1 + b^2 P_3)^{-1} \rho^2}{1 - \rho^2} \right) \text{ bits}$$

of sum capacity if  $b^2 \geq 1$  and  $a^2 \geq \frac{(1 + b^2 P_3)^2}{\rho^2}$

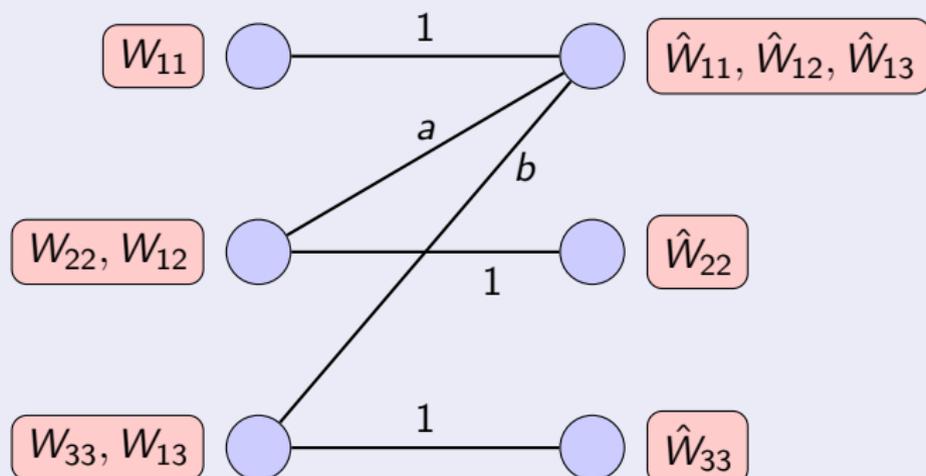
# Sum-rate optimality proofs: Outline

Need an upper bound that matches achievable sum-rate

Upper bound using

- Fano's inequality
- Degraded receivers
- Worst-case additive noise result, Entropy-Power inequality (EPI)
- Genie-aided channel/Channel with side information (M2 & M3)

## Degraded receivers

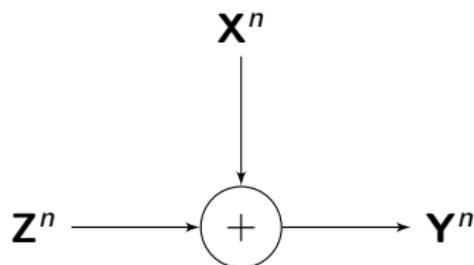


- If  $a^2 \leq 1$ , Rx 1 is a degraded version of Rx 2 w.r.t.  $W_{12}$

$$H(W_{12}|\mathbf{y}_2^n) \leq H(W_{12}|\mathbf{y}_1^n) \leq n\epsilon_n$$

- If  $b^2 \leq 1$ , Rx 1 is a degraded version of Rx 3 w.r.t.  $W_{13}$

# Worst-case additive noise



- $\mathbf{Z}^n \sim \mathcal{N}(\mathbf{0}, \Sigma_Z)$  IID
- $\mathbf{X}^n$ : average covariance constraint  $\Sigma_X$

Worst case noise result (Diggavi & Cover 01, Annapureddy & Veeravalli 09)

$$h(\mathbf{X}^n) - h(\mathbf{X}^n + \mathbf{Z}^n) \leq nh(\mathbf{X}_G) - nh(\mathbf{X}_G + \mathbf{Z}),$$

where  $\mathbf{X}_G \sim \mathcal{N}(\mathbf{0}, \Sigma_X)$ .

## Another result<sup>2</sup>

$$\begin{aligned} \sum_{i=1}^K h(X_i^n + Z_i^n) &- h\left(\sum_{i=1}^K c_i X_i^n + Z_1^n\right) \\ &\leq n \sum_{i=1}^K h(X_{iG} + Z_i) - nh\left(\sum_{i=1}^K c_i X_{iG} + Z_1\right), \\ &\quad \text{if } \sum_{i=1}^K c_i^2 \leq \sigma^2 \end{aligned}$$

- $X_i^n$  with power constraint  $\sum_{j=1}^n \mathbb{E}[(X_{ij}^2)] \leq nP_i$
- $Z_1^n$  vector with IID  $\mathcal{N}(0, \sigma^2)$  components
- $Z_i^n$ ,  $i \neq 1$  vector with IID  $\mathcal{N}(0, 1)$  components
- $X_i^n$  are independent of  $Z_i^n$
- $X_{iG} \sim \mathcal{N}(0, P_i)$

<sup>2</sup>Lemma 5 from Annapureddy & Veeravalli 2009 in different form

# Proof of sum-rate optimality of Strategy M1 (1)

Let  $S$  denote any achievable sum-rate. Want to show

$$S \leq I(x_{1G}; y_{1G}) + I(x_{2G}; y_{2G}) + I(x_{3G}; y_{3G}).$$

$$\begin{aligned} nS &\leq H(W_{11}) + H(W_{12}, W_{22}) + H(W_{13}, W_{33}) \\ &= I(W_{11}; \mathbf{y}_1^n) + \sum_{i=2}^3 I(W_{1i}, W_{ii}; \mathbf{y}_i^n) \\ &\quad + H(W_{11} | \mathbf{y}_1^n) + \sum_{i=2}^3 H(W_{1i}, W_{ii} | \mathbf{y}_i^n) \\ &\leq I(\mathbf{x}_1^n; \mathbf{y}_1^n) + \sum_{i=2}^3 I(\mathbf{x}_i^n; \mathbf{y}_i^n) \\ &\quad + H(W_{11} | \mathbf{y}_1^n) + \sum_{i=2}^3 H(W_{1i}, W_{ii} | \mathbf{y}_i^n) \end{aligned}$$

## Proof of sum-rate optimality of Strategy M1 (2)

$$nS \leq I(\mathbf{x}_1^n; \mathbf{y}_1^n) + \sum_{i=2}^3 I(\mathbf{x}_i^n; \mathbf{y}_i^n) + H(W_{11} | \mathbf{y}_1^n) + \sum_{i=2}^3 H(W_{1i}, W_{ii} | \mathbf{y}_i^n)$$

$$\stackrel{(a)}{\leq} h(\mathbf{y}_1^n) - h(a\mathbf{x}_2^n + b\mathbf{x}_3^n + \mathbf{n}_1^n) + h(\mathbf{x}_2^n + \mathbf{n}_2^n) - h(\mathbf{n}_2^n) + h(\mathbf{x}_3^n + \mathbf{n}_3^n) - h(\mathbf{n}_3^n) + 5\epsilon_n$$

$$\stackrel{(b)}{\leq} nh(y_{1G}) - nh(ax_{2G} + bx_{3G} + n_1) + nh(x_{2G} + n_2) + nh(x_{3G} + n_3) - nh(n_2) - nh(n_3) + 5\epsilon_n$$

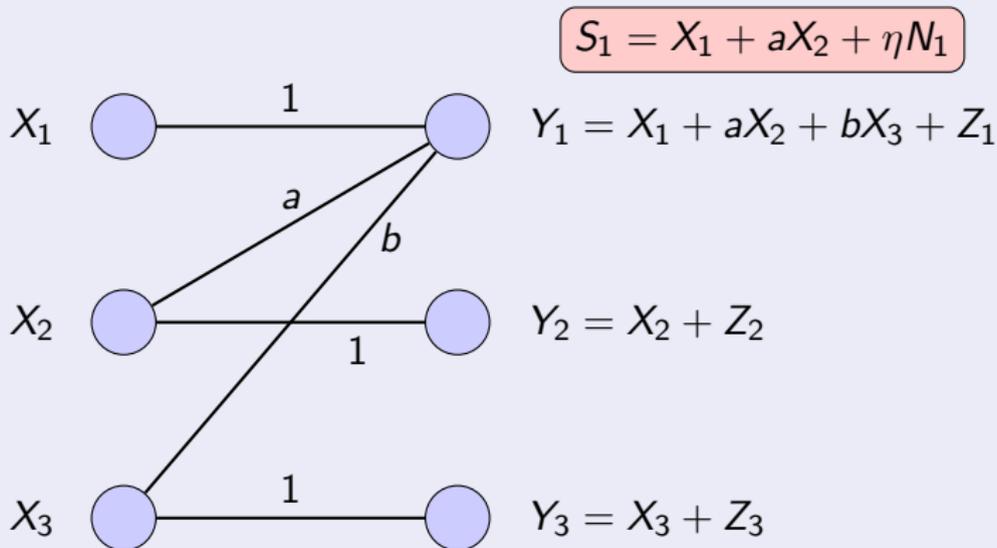
$$= nI(x_{1G}; y_{1G}) + nI(x_{2G}; y_{2G}) + nI(x_{3G}; y_{3G}) + 5\epsilon_n,$$

(a): Fano's inequality,  $a^2 \leq 1$  and  $b^2 \leq 1$

(b): Generalized form of worst-case noise result,  $a^2 + b^2 \leq 1$

# Proof of sum-rate optimality of Strategy M2 (1)

Want to show  $S \leq I(x_{1G}, x_{2G}; y_{1G}) + I(x_{3G}; y_{3G})$ .



- Show  $S \leq I(x_{1G}, x_{2G}; y_{1G}, s_{1G}) + I(x_{3G}; y_{3G})$
- $E[N_1 Z_1] = \rho$ ,  $\eta > 0$  chosen later

## Proof of sum-rate optimality of Strategy M2 (2)

$$\begin{aligned} nS &\leq H(W_{11}, W_{12}, W_{22}) + H(W_{13}, W_{33}) \\ &= I(W_{11}, W_{12}, W_{22}; \mathbf{y}_1^n, \mathbf{s}_1^n) + H(W_{11} | \mathbf{y}_1^n, \mathbf{s}_1^n) + H(W_{12} | \mathbf{y}_1^n, \mathbf{s}_1^n, \mathbf{x}_1^n) \\ &\quad + H(W_{22} | \mathbf{y}_1^n, \mathbf{s}_1^n, \mathbf{x}_1^n, W_{12}) + I(W_{13}, W_{33}; \mathbf{y}_3^n) + H(W_{13} | \mathbf{y}_3^n) \\ &\quad + H(W_{33} | \mathbf{y}_3^n, W_{13}) \\ &\leq I(\mathbf{x}_1^n, \mathbf{x}_2^n; \mathbf{y}_1^n, \mathbf{s}_1^n) + H(W_{11} | \mathbf{y}_1^n) + H(W_{12} | \mathbf{y}_1^n) \\ &\quad + H(W_{22} | \mathbf{s}_1^n, \mathbf{x}_1^n) + I(\mathbf{x}_3^n; \mathbf{y}_3^n) + H(W_{13} | \mathbf{y}_3^n) + H(W_{33} | \mathbf{y}_3^n), \\ &\stackrel{(a)}{\leq} I(\mathbf{x}_1^n, \mathbf{x}_2^n; \mathbf{y}_1^n, \mathbf{s}_1^n) + I(\mathbf{x}_3^n; \mathbf{y}_3^n) + 5n\epsilon_n \end{aligned} \quad (1)$$

(a):  $\eta^2 \leq a^2$  and  $b^2 \leq 1$

## Proof of sum-rate optimality of Strategy M2 (3)

$$\begin{aligned}
 nS &\leq I(\mathbf{x}_1^n, \mathbf{x}_2^n; \mathbf{y}_1^n, \mathbf{s}_1^n) + I(\mathbf{x}_3^n; \mathbf{y}_3^n) + 5n\epsilon_n \\
 &= I(\mathbf{x}_1^n, \mathbf{x}_2^n; \mathbf{s}_1^n) + I(\mathbf{x}_1^n, \mathbf{x}_2^n; \mathbf{y}_1^n | \mathbf{s}_1^n) + I(\mathbf{x}_3^n; \mathbf{y}_3^n) + 5n\epsilon_n \\
 &= h(\mathbf{s}_1^n) - h(\mathbf{s}_1^n | \mathbf{x}_1^n, \mathbf{x}_2^n) + h(\mathbf{y}_1^n | \mathbf{s}_1^n) \\
 &\quad - h(\mathbf{y}_1^n | \mathbf{s}_1^n, \mathbf{x}_1^n, \mathbf{x}_2^n) + h(\mathbf{y}_3^n) - h(\mathbf{y}_3^n | \mathbf{x}_3^n) + 5n\epsilon_n \\
 &\leq nh(s_{1G}) - nh(\eta z_1) + nh(y_{1G} | s_{1G}) \\
 &\quad - h(b\mathbf{x}_3^n + \tilde{\mathbf{n}}_1^n) + h(\mathbf{x}_3^n + \mathbf{n}_3^n) - nh(n_3) + 5n\epsilon_n \\
 &\stackrel{(b)}{\leq} nh(s_{1G}) - nh(\eta z_1) + nh(y_{1G} | s_{1G}) \\
 &\quad - nh(bx_{3G} + \tilde{n}_1) + nh(x_{3G} + n_3) - nh(n_3) + 5n\epsilon_n \\
 &= nI(x_{1G}, x_{2G}; y_{1G}, s_{1G}) + nI(x_{3G}; y_{3G}) + 5n\epsilon_n,
 \end{aligned}$$

(b):  $b^2 \leq 1 - \rho^2$

## Proof of sum-rate optimality of Strategy M2 (4)

Choose

$$\eta\rho = 1 + b^2P_3$$

to get

$$I(x_{1G}, x_{2G}; y_{1G}, s_{1G}) = I(x_{1G}, x_{2G}; y_{1G})$$

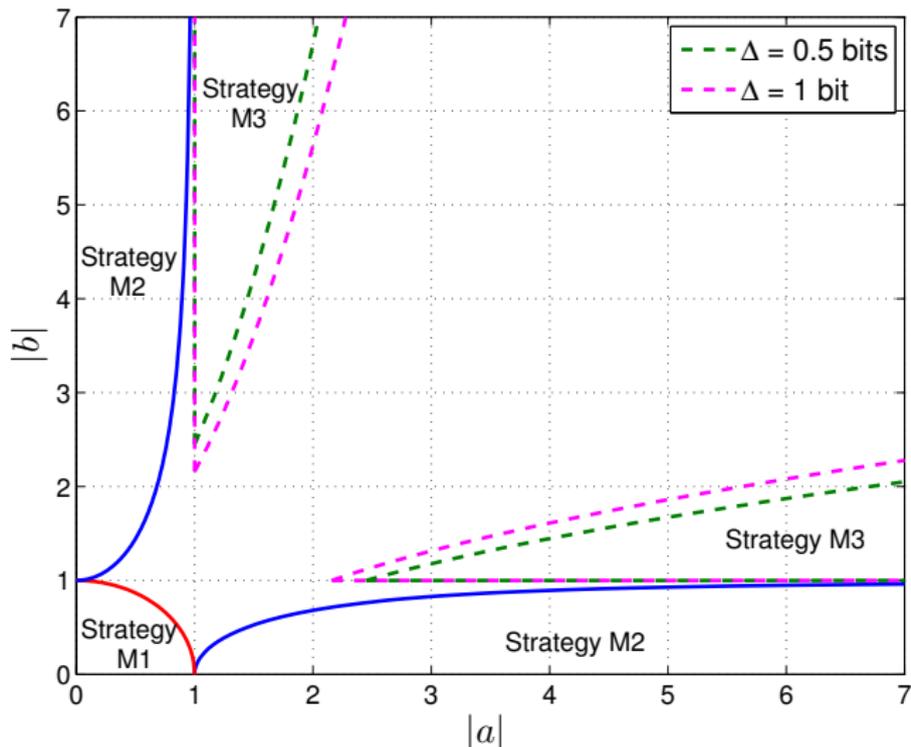
Then, choose

$$\rho^2 = 1 - b^2$$

to get the final result

$$b^2 < 1 \quad \text{and} \quad a^2 \geq \frac{(1 + b^2P_3)^2}{1 - b^2}$$

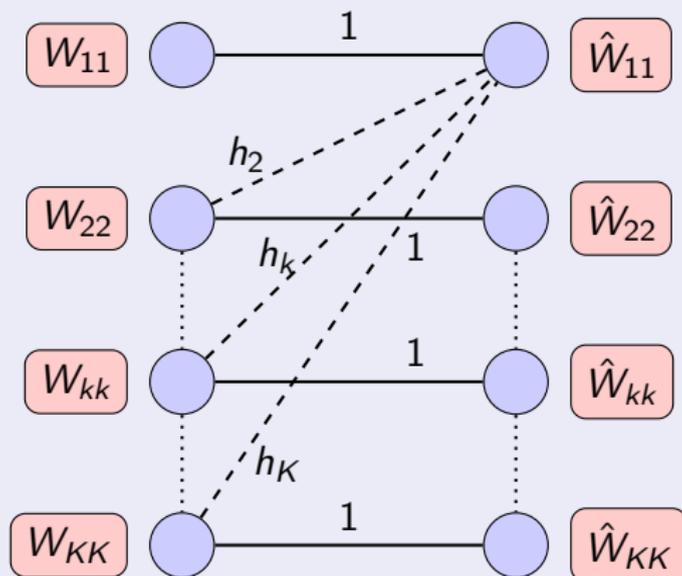
## Back to the numerical result



- $P_1 = P_2 = P_3 = 0$  dB

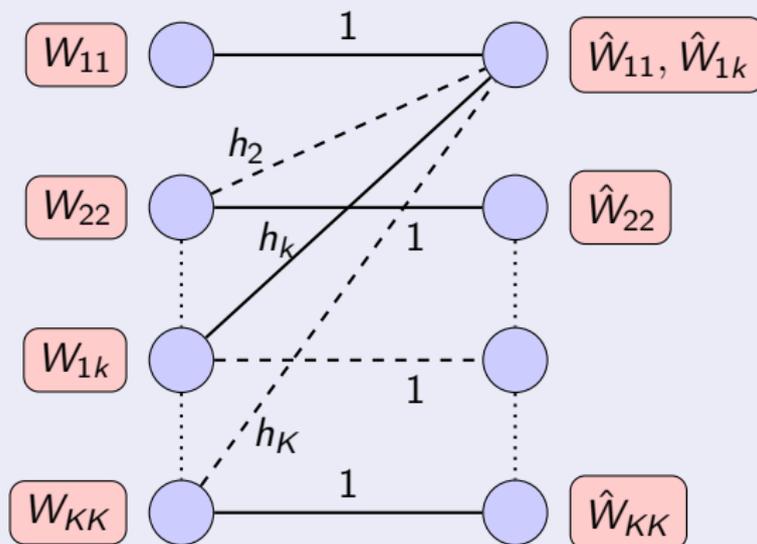
# Gaussian $K \times K$ many-to-one XC

## Strategy M1 for the $K \times K$ many-to-one XC



Strategy M1 achieves sum capacity if  $\sum_{j=2}^K h_j^2 < 1$

## Strategy M2 for the $K \times K$ many-to-one XC

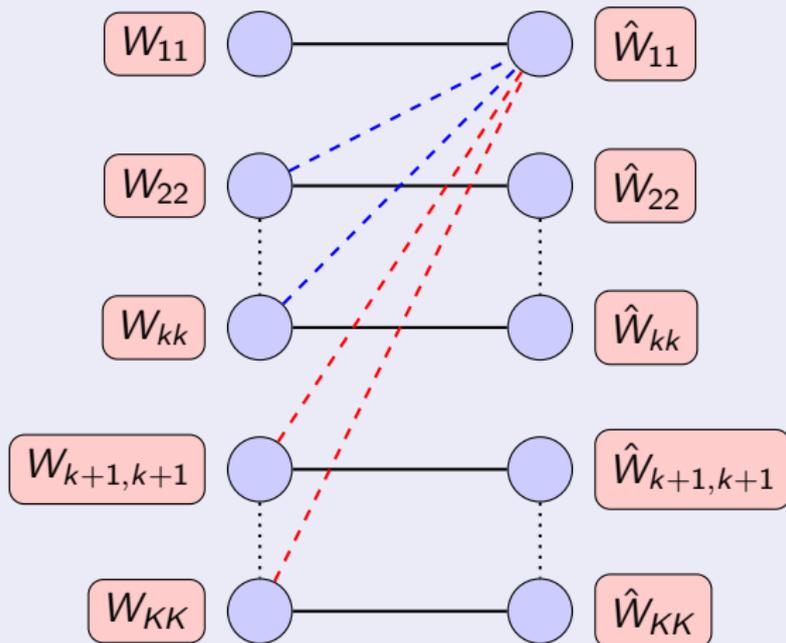


Strategy M2 achieves sum capacity if

$$\sum_{j=2, j \neq k}^K h_j^2 < 1 \text{ and } h_k^2 \geq \frac{(1 + \sum_{j=2}^K h_j^2 P_j)^2}{1 - \sum_{j=2, j \neq k}^K h_j^2}$$

# Gaussian $K$ -user many-to-one IC

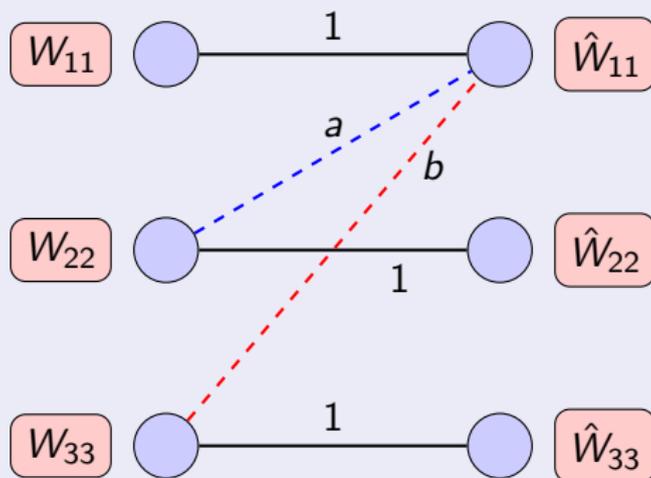
## $K \times K$ many-to-one IC



Strategies  $MI_k$  for  $k = 1, 2, \dots, K$

- Decode interference from transmitters 2 to  $k$  (for  $k \geq 2$ )
- Treat interference from transmitters  $k + 1$  to  $K$  as noise

## Strategy MI2 for the $3 \times 3$ many-to-one IC (1)



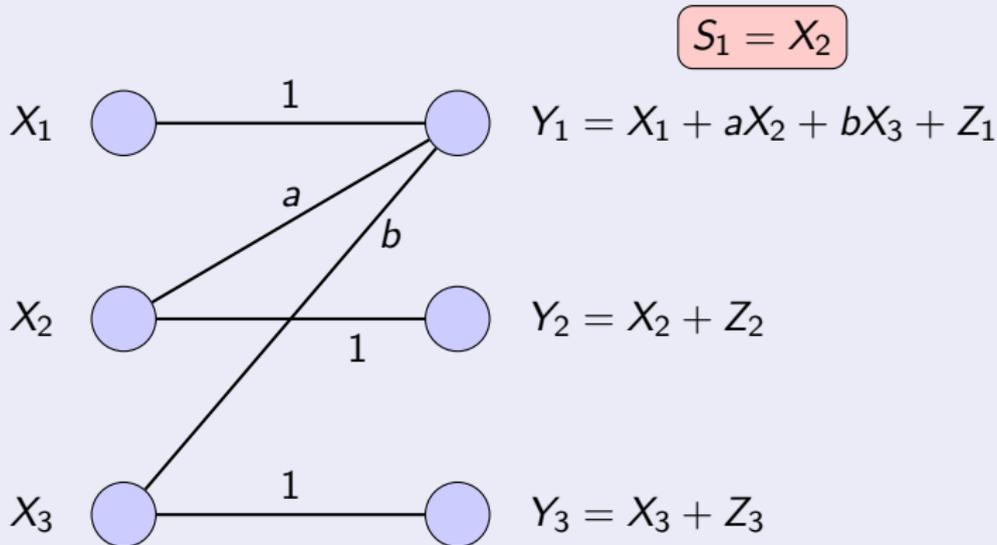
Achieved sum-rate

$$R_{sum} = \frac{1}{2} \log_2 \left( 1 + \frac{P_1}{b^2 P_3 + 1} \right) + \frac{1}{2} \log_2 (1 + P_2) + \frac{1}{2} \log_2 (1 + P_3)$$

Required condition:  $a^2 \geq 1 + P_1 + b^2 P_3$

## Strategy MI2 for the $3 \times 3$ many-to-one IC (2)

Want to show  $S \leq I(x_{1G}; y_{1G}|x_{2G}) + I(x_{2G}; y_{2G}) + I(x_{3G}; y_{3G})$ .

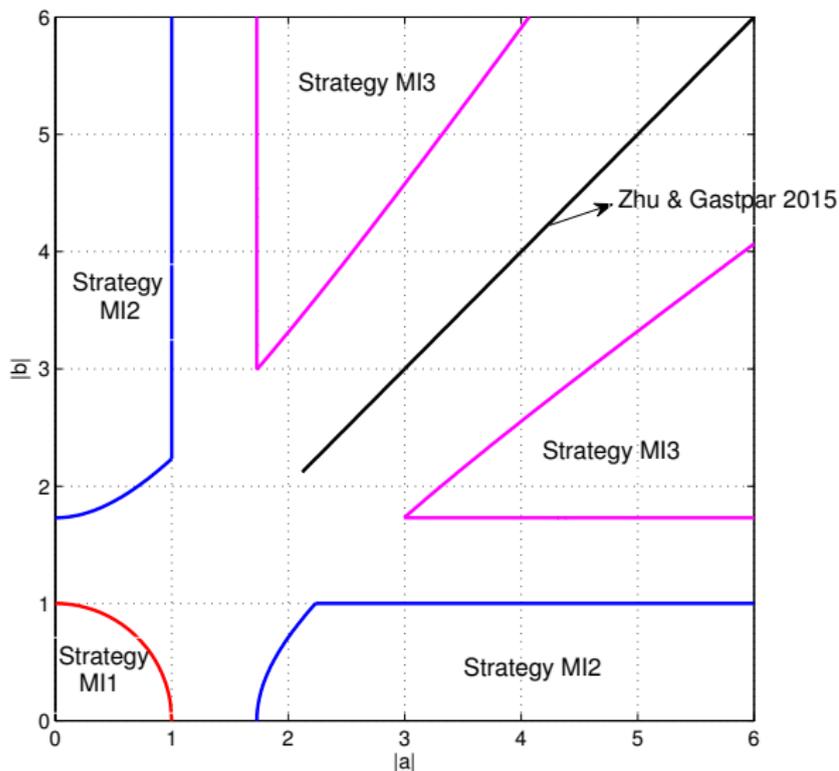


- Need  $b^2 \leq 1$

## Summary of conditions for $3 \times 3$ many-to-one IC

Strategy	Channel conditions
$MI1$	$a^2 + b^2 \leq 1$
$MI2$	(i) $a^2 \geq 1 + P_1 + b^2 P_3, b^2 \leq 1$
	(ii) $b^2 \geq 1 + P_1 + a^2 P_2, a^2 \leq 1$
$MI3$	(i) $a^2 \geq 1 + P_1 + b^2 P_3, b^2 \geq 1 + P_1$
	(ii) $b^2 \geq 1 + P_1 + a^2 P_2, a^2 \geq 1 + P_1$

# Result for the $3 \times 3$ many-to-one IC



$$P_1 = P_2 = P_3 = 3\text{dB}$$

# Summary

# Summary

## Many-to-one XC

- Strategies where a **subset** of interfering signals are treated as noise
- Conditions for sum-rate optimality
- $3 \times 3$  case
- $K \times K$  case

## Many-to-one IC

- Strategies MIIK and conditions for sum-rate optimality

# Summary

## Many-to-one XC

- Strategies where a **subset** of interfering signals are treated as noise
- Conditions for sum-rate optimality
- $3 \times 3$  case
- $K \times K$  case

## Many-to-one IC

- Strategies M1k and conditions for sum-rate optimality

## Possible Extensions

- More general topologies
  - ▶ Bounds using many-to-one results
  - ▶ Approximate sum-rate optimality
  - ▶ Recent results for strategy M1 (TIN) by Geng, Sun & Jafar 2014

Thank you

<http://www.ee.iitm.ac.in/~skrishna/>