

Ergodic Interference Alignment

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K -User Interference Channel



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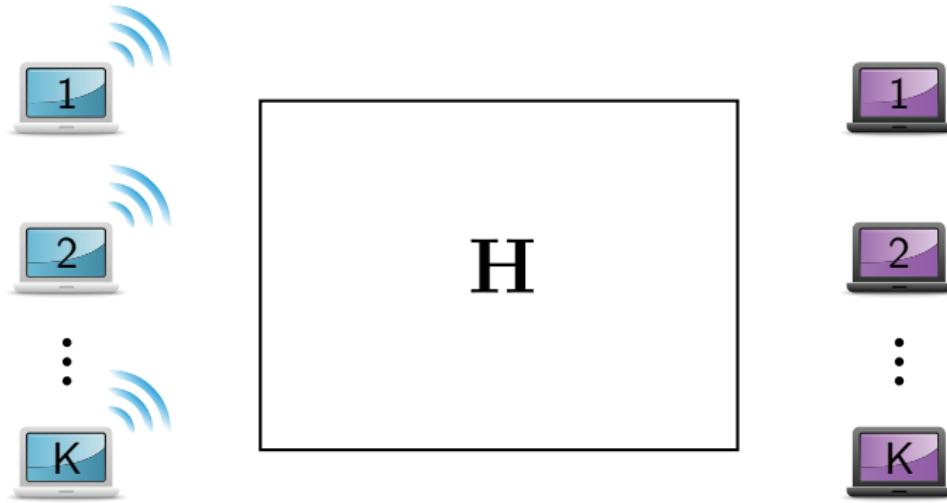
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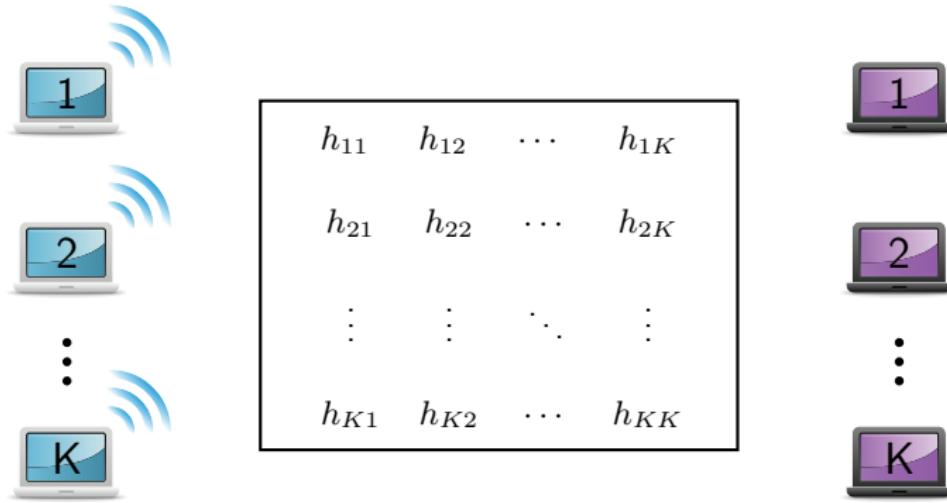
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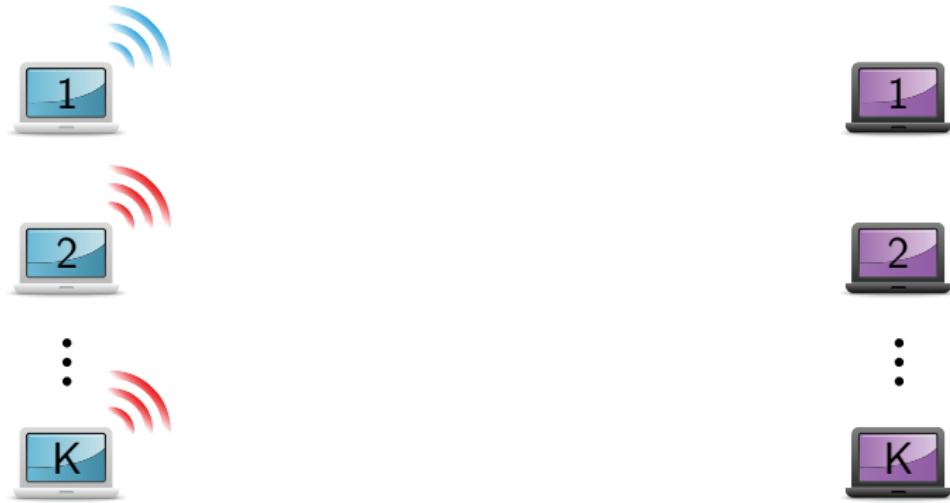
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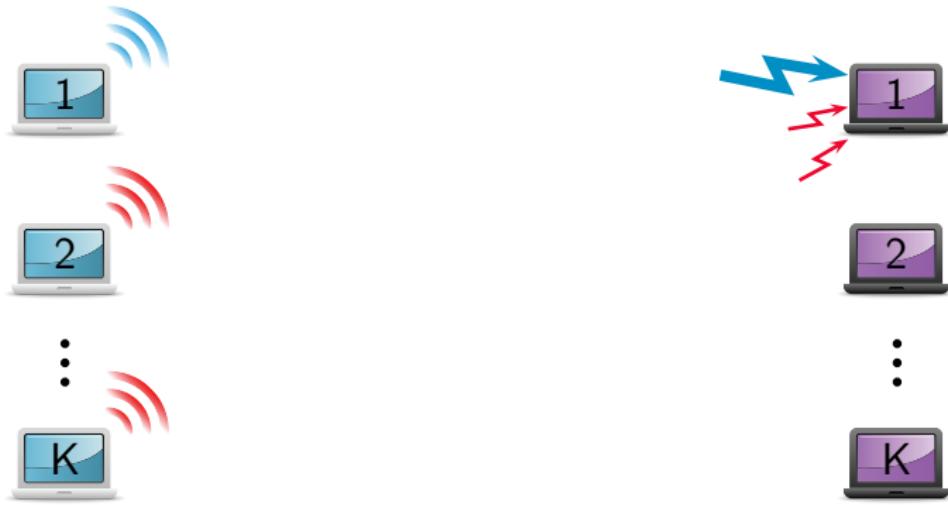
- Strategy: decode and remove **interfering signals**.
- Optimal if interference is **very strong**.
(Carleial '75, Sato '81, Han-Kobayashi '81, Sankar-Erkip-Poor '08, Sridharan-Jafarian-Jafar-Vishwanath '08)

Weak Interference



- Strategy: treat **interference** as noise.

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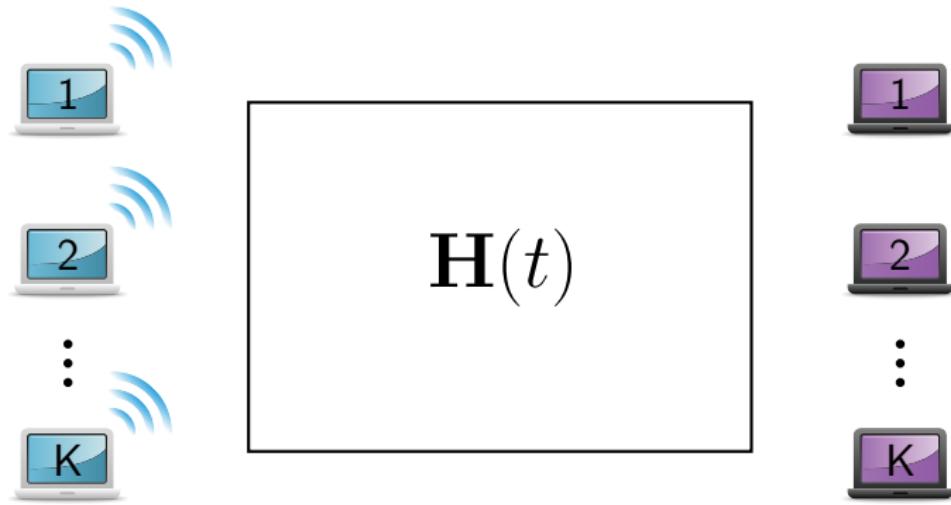
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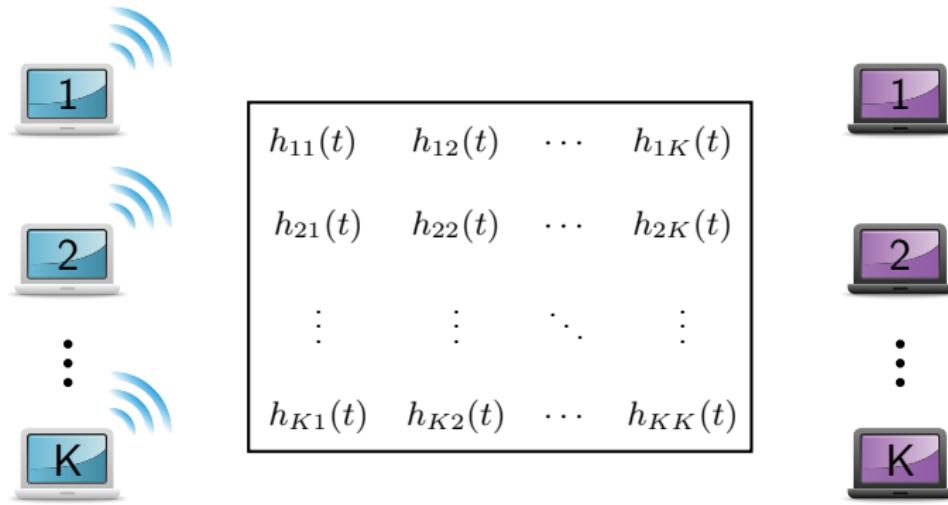
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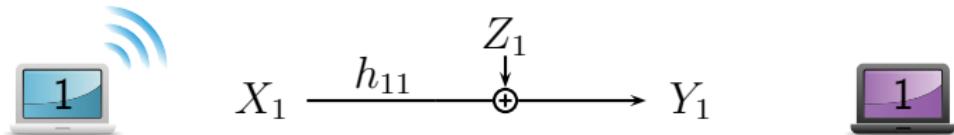
- Channel coefficients have **i.i.d. uniform phase**.
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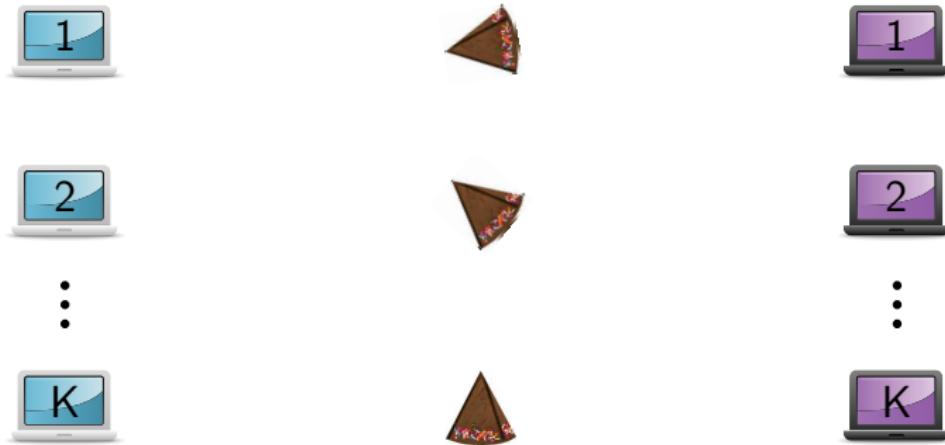
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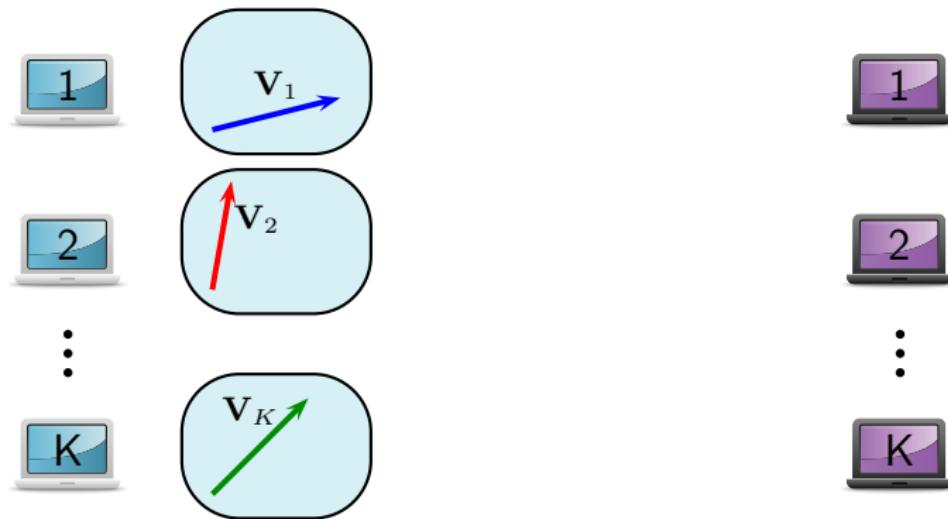
Interference Alignment



Cadambe-Jafar '08: With careful choice of precoding matrices, each user can get “half the cake” as the $\text{SNR} \rightarrow \infty$:

$$\lim_{P_k \rightarrow \infty} \frac{R_k^{IA}}{E_{\mathbf{H}} [\log (1 + |h_{kk}|^2 P_k)]} = \frac{1}{2}$$

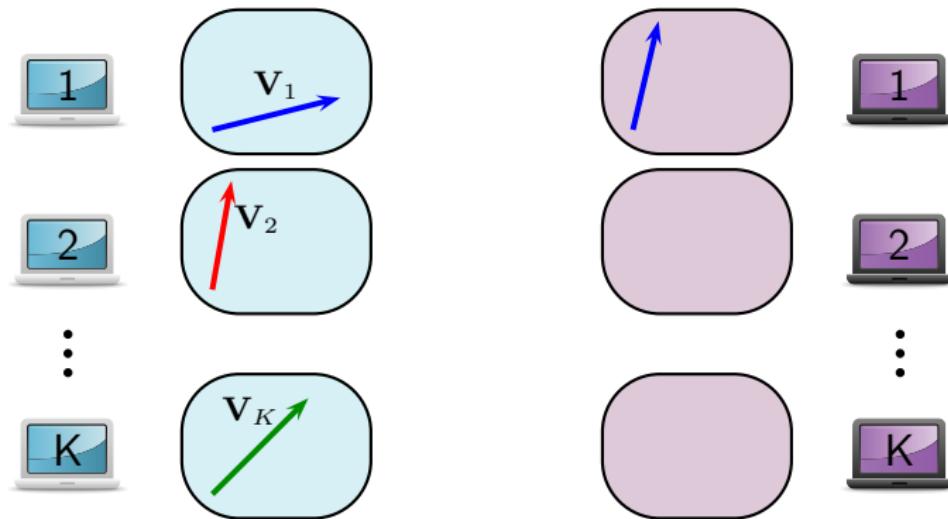
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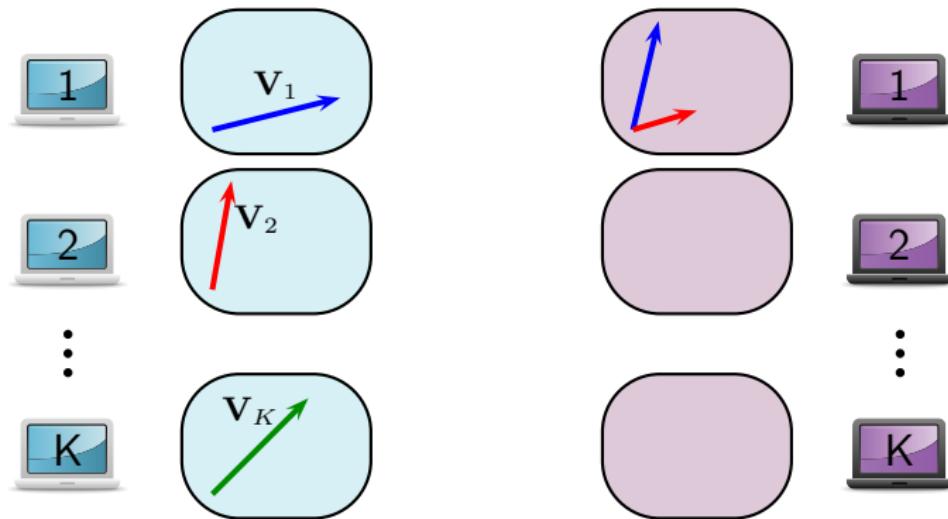
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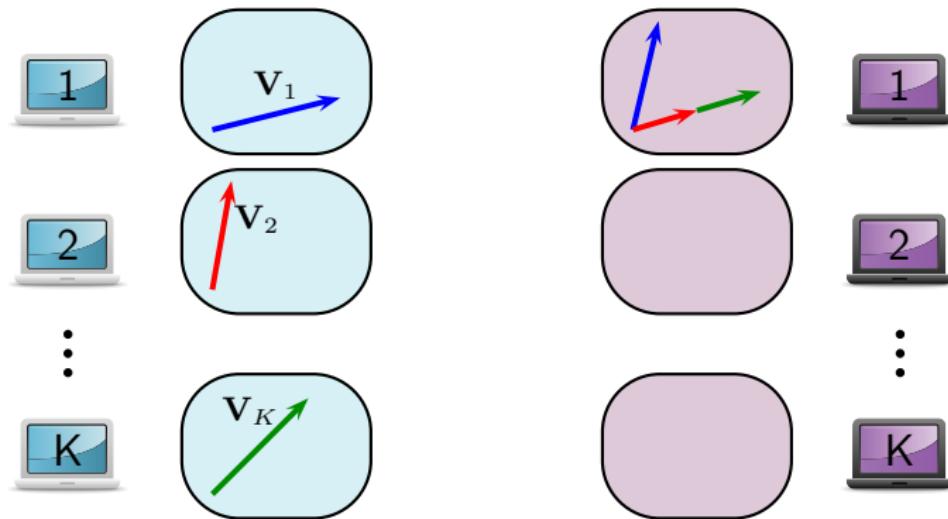
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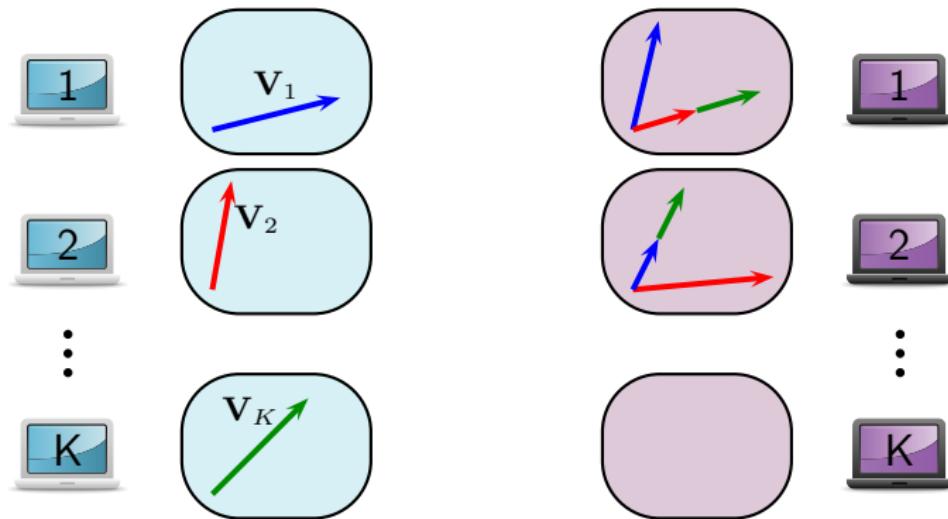
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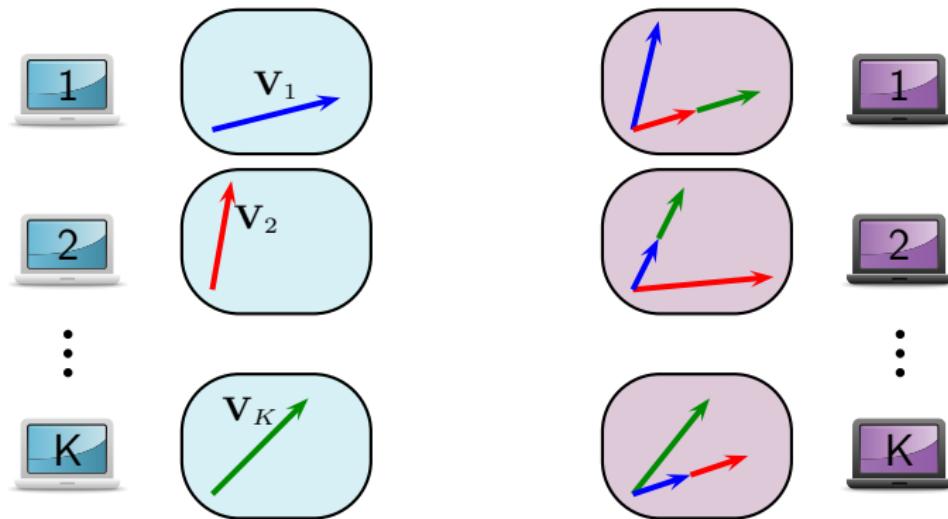
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- **New Scheme:** gets (slightly more than) **half** the interference-free rate at **any SNR!**

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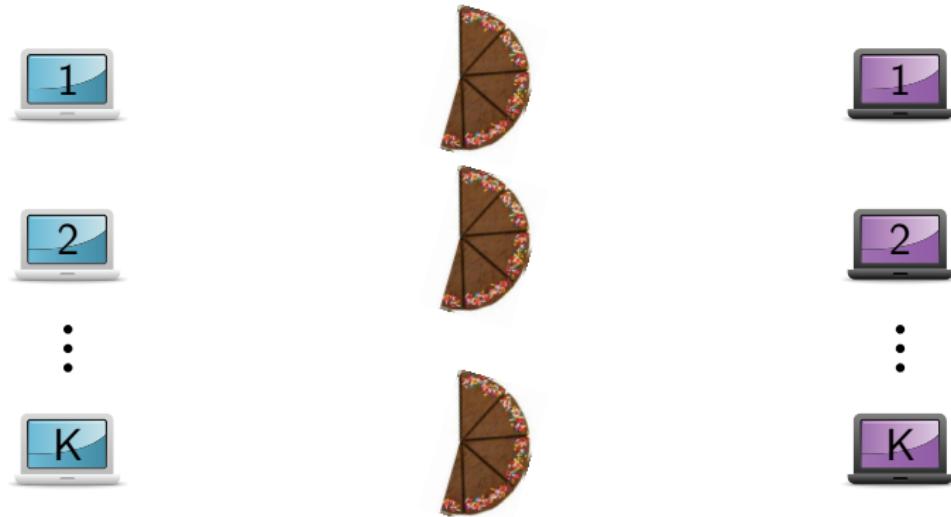
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$$\mathbf{H} = \begin{bmatrix} h_{11} & h_{12} & \cdots & h_{1K} \\ h_{21} & h_{22} & \cdots & h_{2K} \\ \vdots & \vdots & \ddots & \vdots \\ h_{K1} & h_{K2} & \cdots & h_{KK} \end{bmatrix}$$

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- Otherwise, transmit new signals and wait for their \mathbf{H}_C .

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Ergodic Interference Alignment

Sum of channel observations is (nearly) interference-free:

$$\mathbf{H} + \mathbf{H}_C = \begin{bmatrix} 2h_{11} & & 0 \\ & \ddots & \\ 0 & & 2h_{MM} \end{bmatrix} \pm \delta$$

Worst case SINR:

$$2P_k \left(\frac{|h_{kk}|^2 - 2\delta(Re(h_{kk}) + Im(h_{kk})) + \delta^2}{1 + 4\delta^2 \sum_{\ell \neq k} P_\ell} \right)$$

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- Choose δ, h_{MAX} to get desired rate gap.
- Since phase is i.i.d. uniform, $P(\mathbf{H}) = P(\mathbf{H}_C)$.

Convergence in Type

Sequence of channel matrices \mathbf{H}^n is ϵ -typical if:

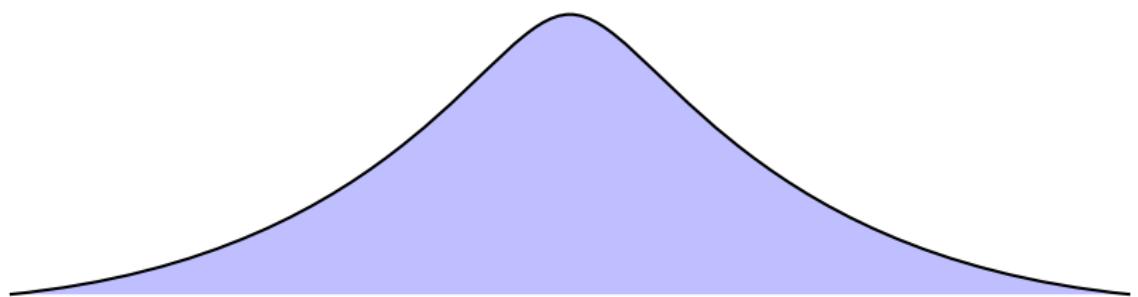
$$\left| \frac{1}{n} N(\mathbf{H} | \mathbf{H}^n) - P(\mathbf{H}) \right| \leq \epsilon \quad \forall \mathbf{H} \in \mathcal{H}$$

Lemma (Csiszar-Körner 2.12)

For any i.i.d. sequence, \mathbf{H}^n , the probability of the set of all ϵ -typical sequences, A_ϵ^n , is lower bounded by:

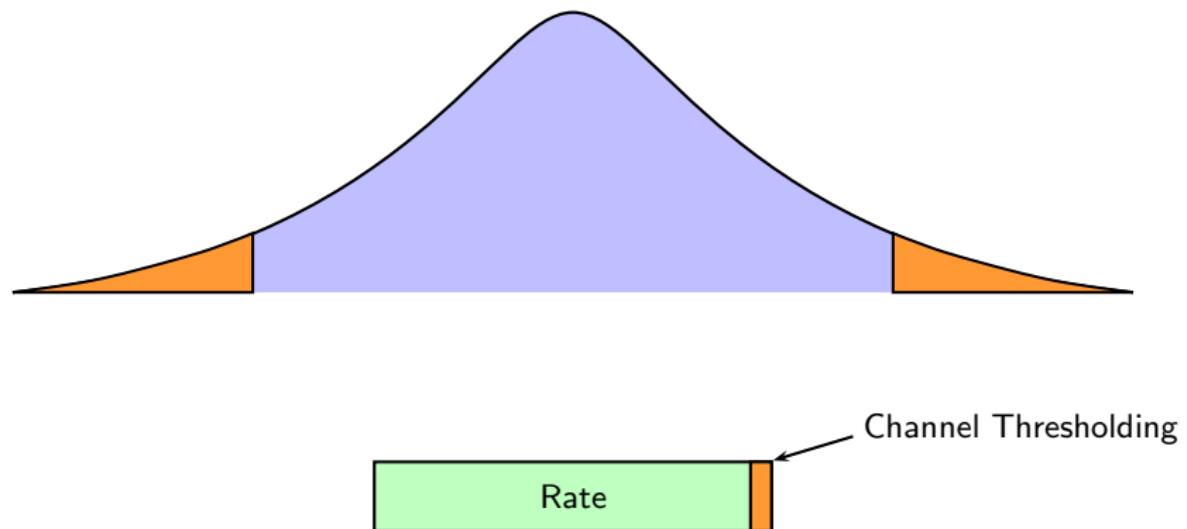
$$P(A_\epsilon^n) \geq 1 - \frac{|\mathcal{H}|}{4n\epsilon^2}$$

Convergence in Type

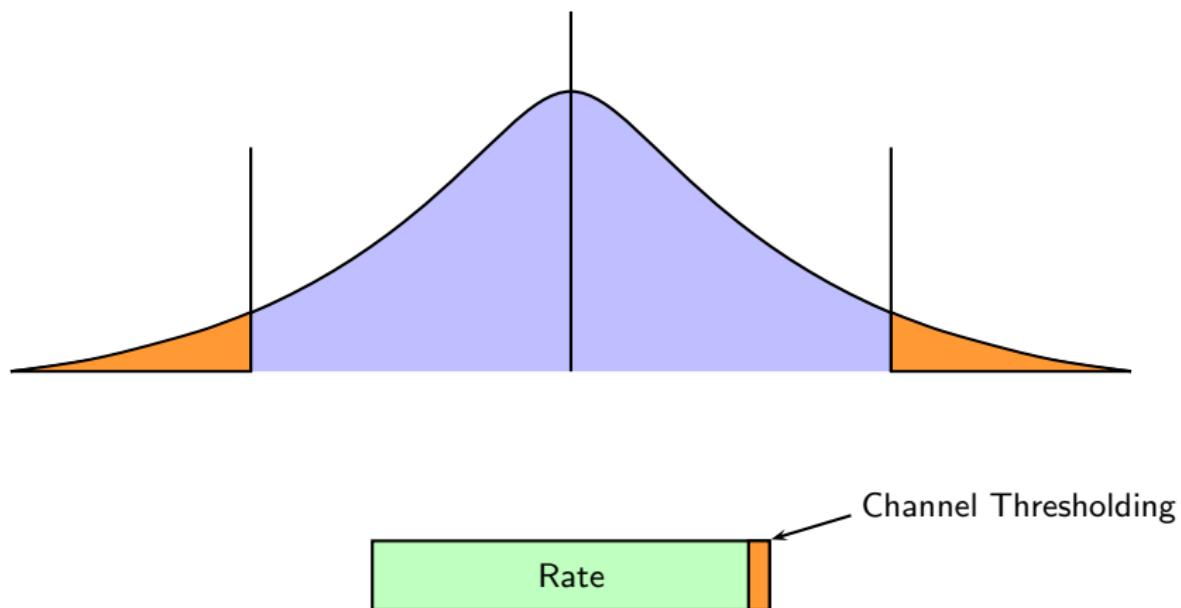


Rate

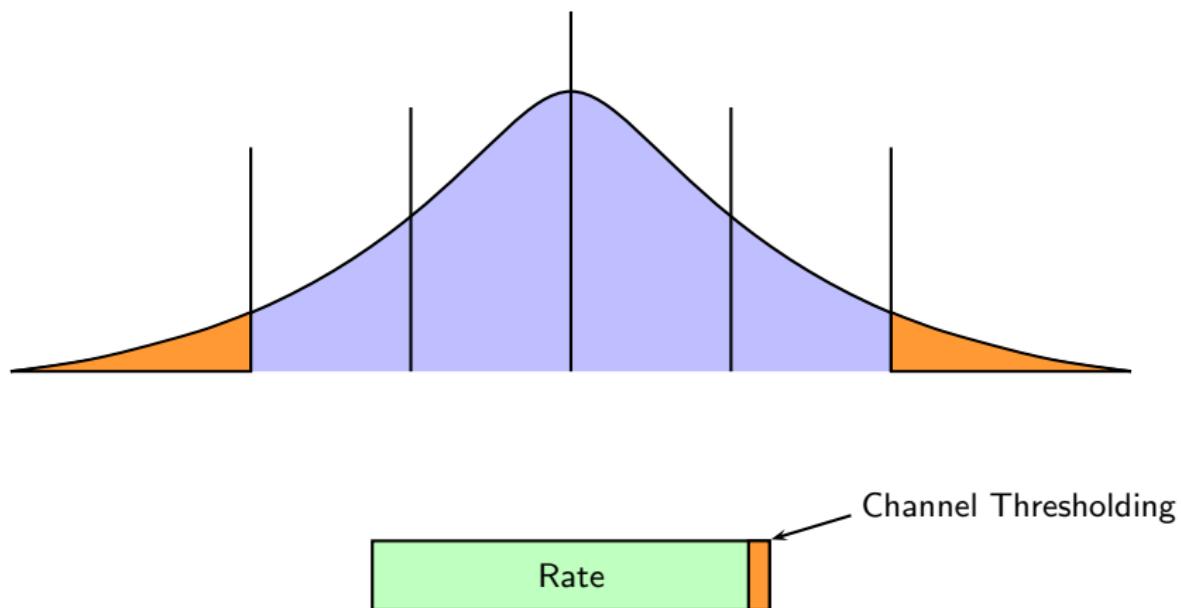
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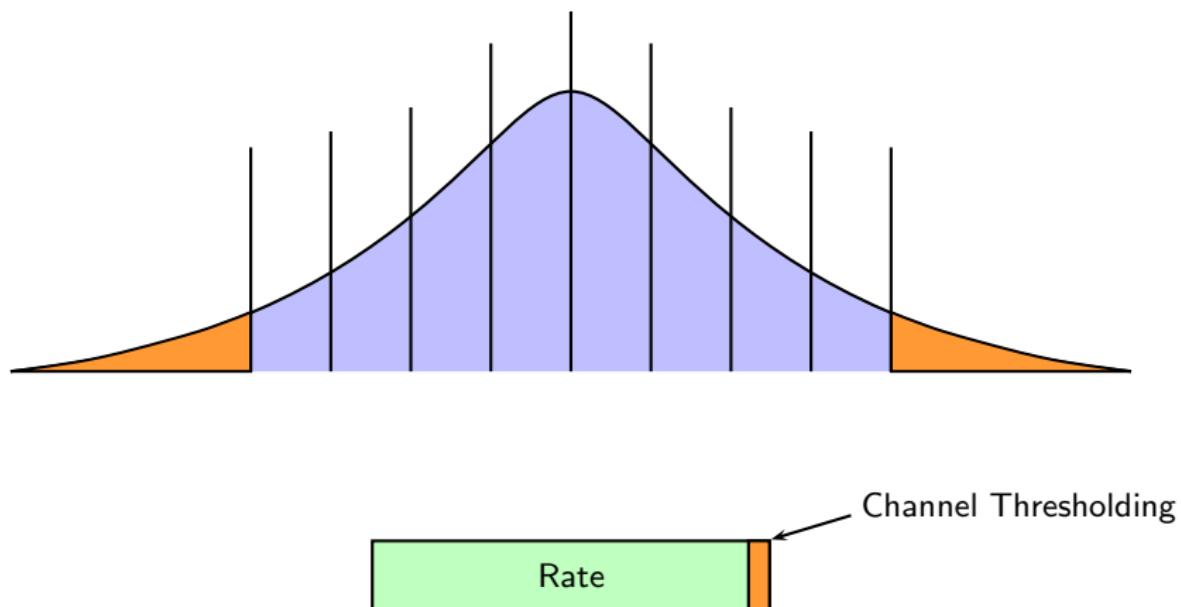
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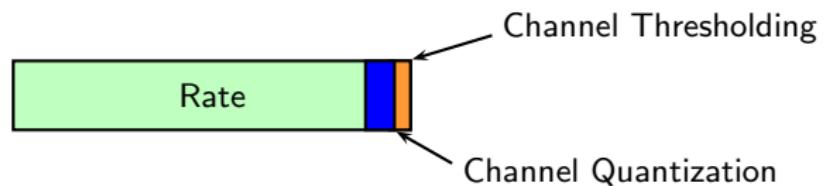
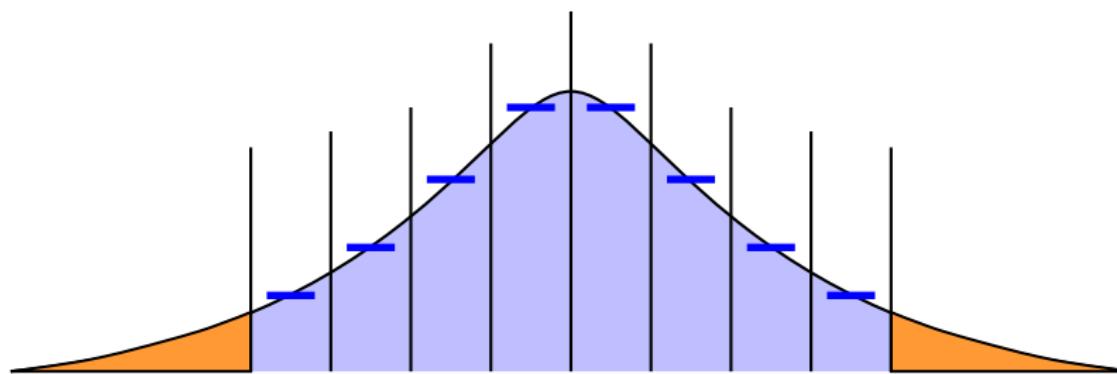
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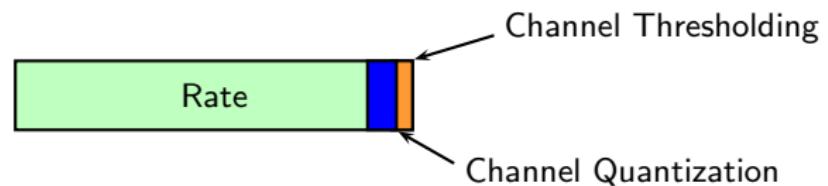
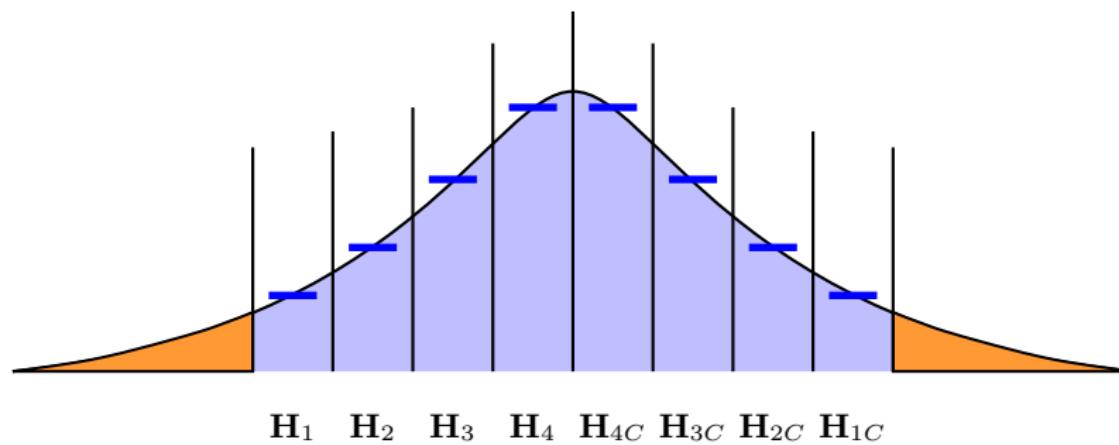
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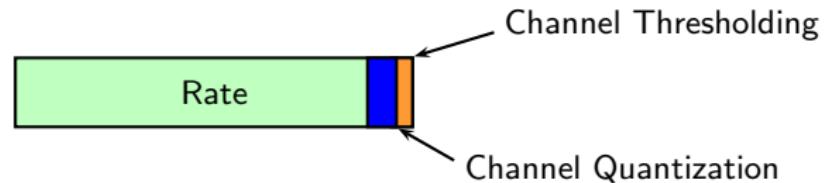
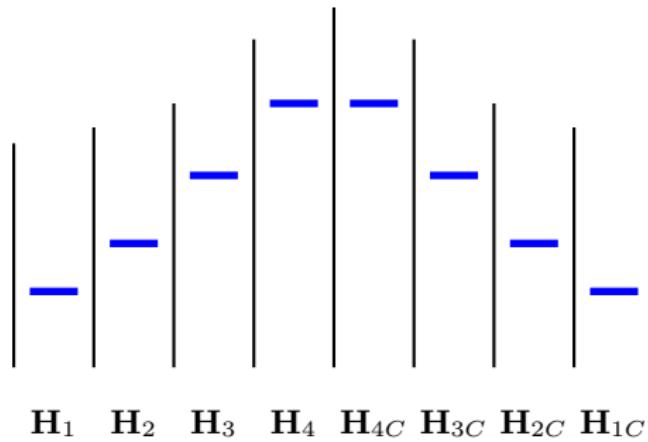
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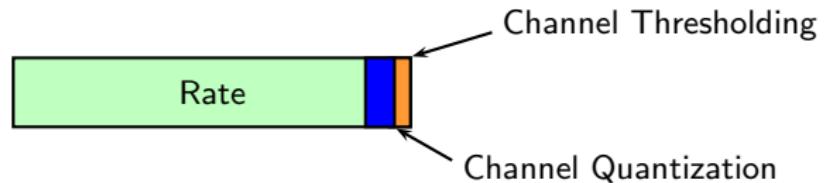
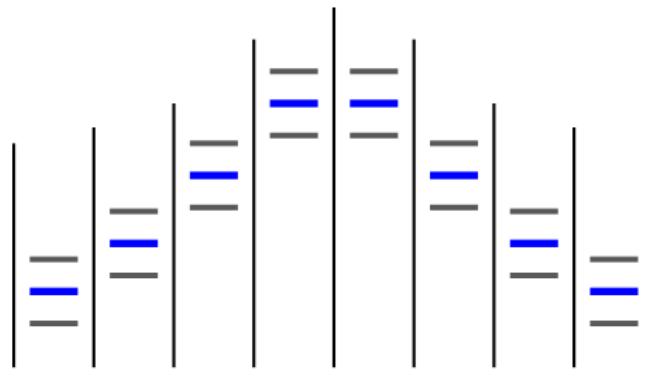
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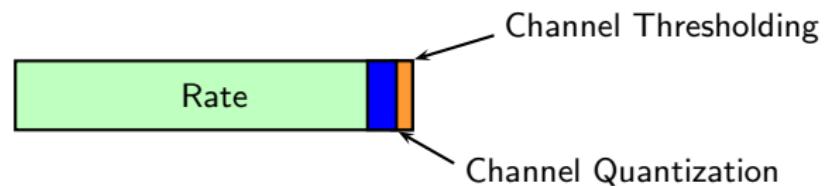
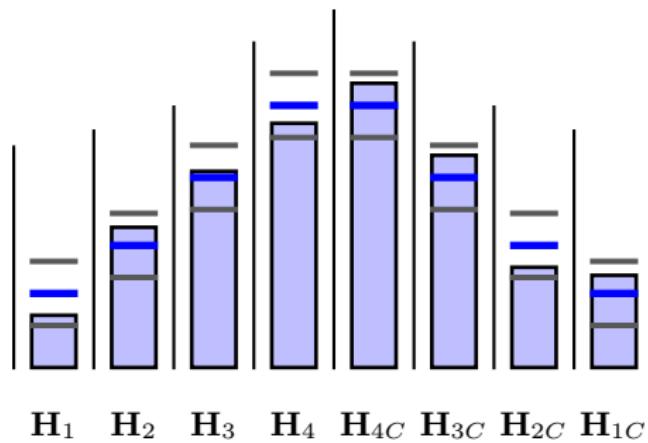
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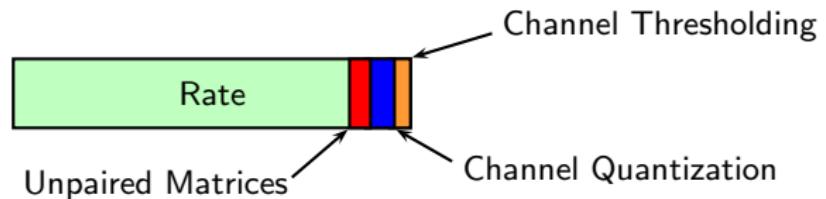
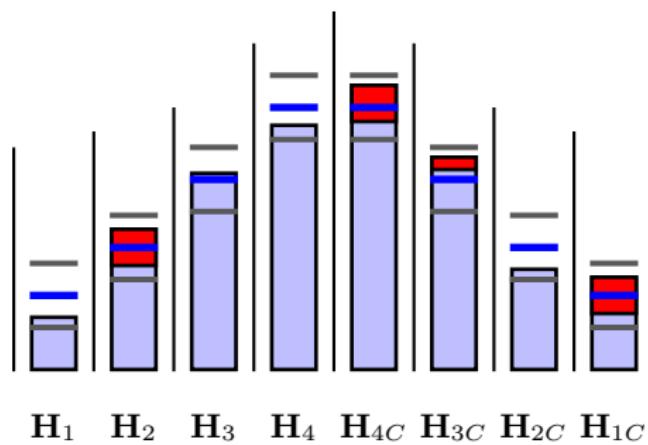
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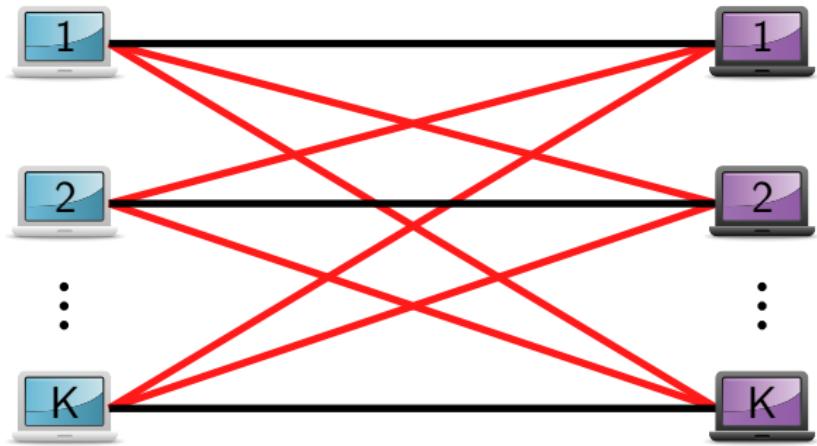
Achievable Rate

Theorem

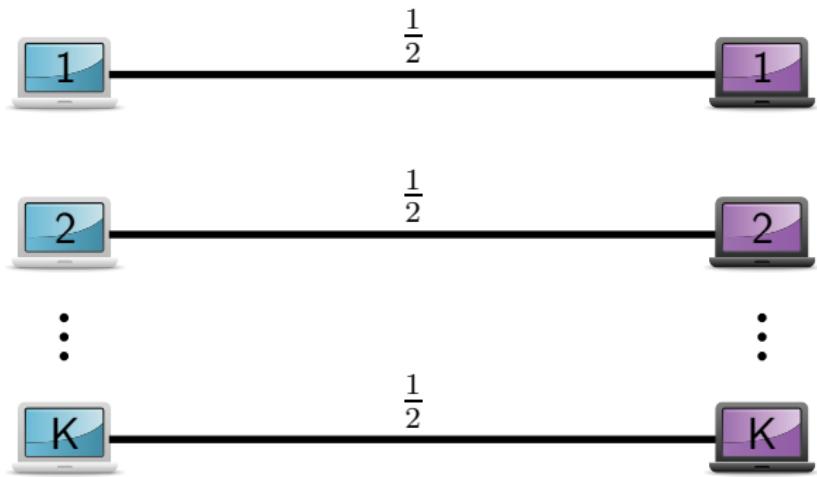
Each user can achieve at least half its interference-free capacity at any signal-to-noise ratio:

$$R_k = \frac{1}{2}E \left[\log \left(1 + 2|h_{kk}|^2 P_k \right) \right] > \frac{1}{2}R_k^{FREE}$$

Network Transformation

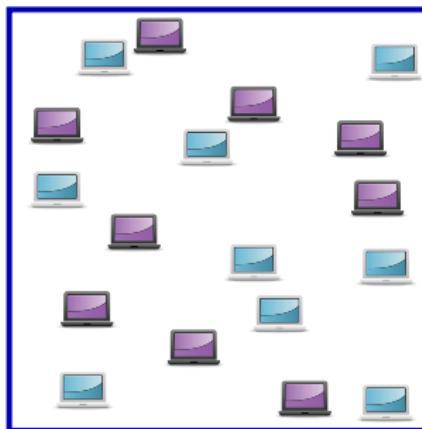


Network Transformation



Phase Fading

- **Jafar '09:** Whenever the channel is in a **bottleneck state**, ergodic alignment achieves the capacity.
- **Example:** K transmitter-receiver pairs randomly placed in a square. Signal strength governed by distance. As $K \rightarrow \infty$, ergodic alignment achieves capacity.



Rayleigh Fading

- For Rayleigh fading, we get a **very weak** interference channel with some constant probability $\rho > 0$.

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- Ignore all **interference** in weak interference case. Get R_k^{WEAK} .

Rayleigh Fading

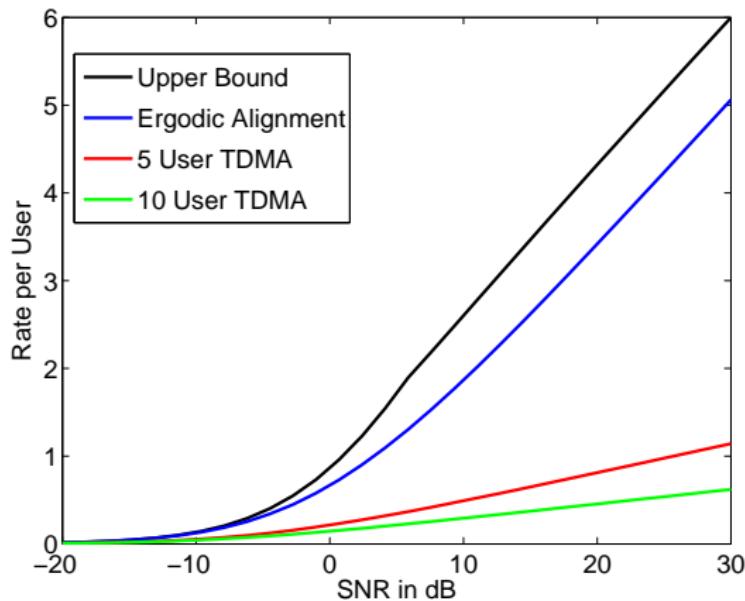
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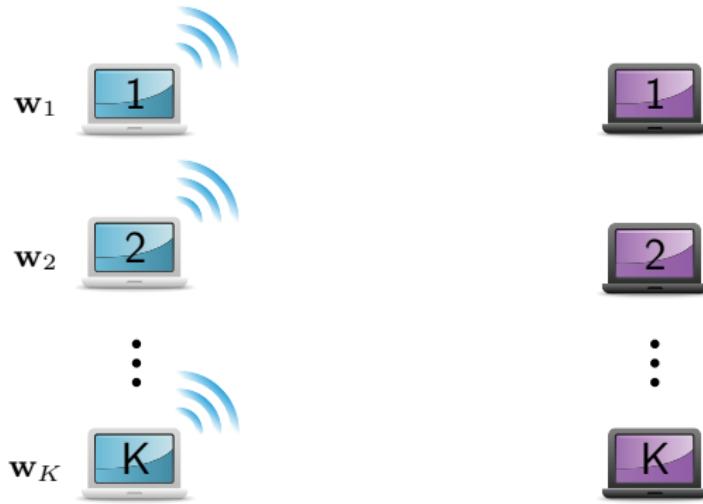
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- Ignore all interference in weak interference case. Get R_k^{WEAK} .
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- Each user gets $R_k = \rho R_k^{\text{WEAK}} + (1 - \rho) R_k^{\text{EA}} > R_k^{\text{EA}}$

Rayleigh Fading

- Channel coefficients i.i.d. Rayleigh.
- Equal transmit power per user.

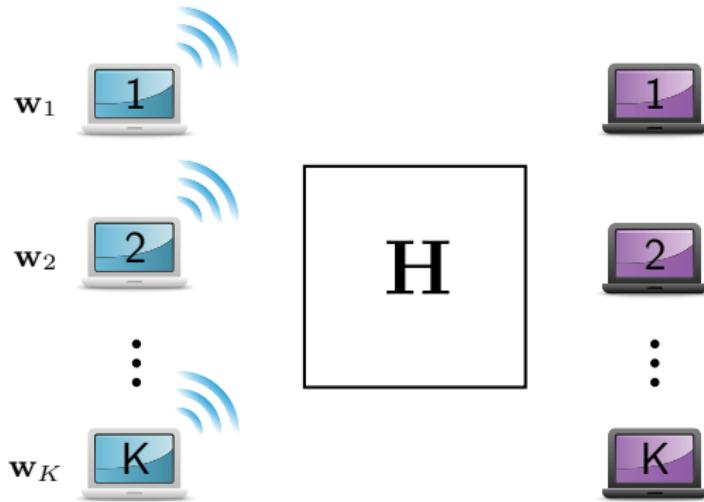


Finite Field Interference Channels



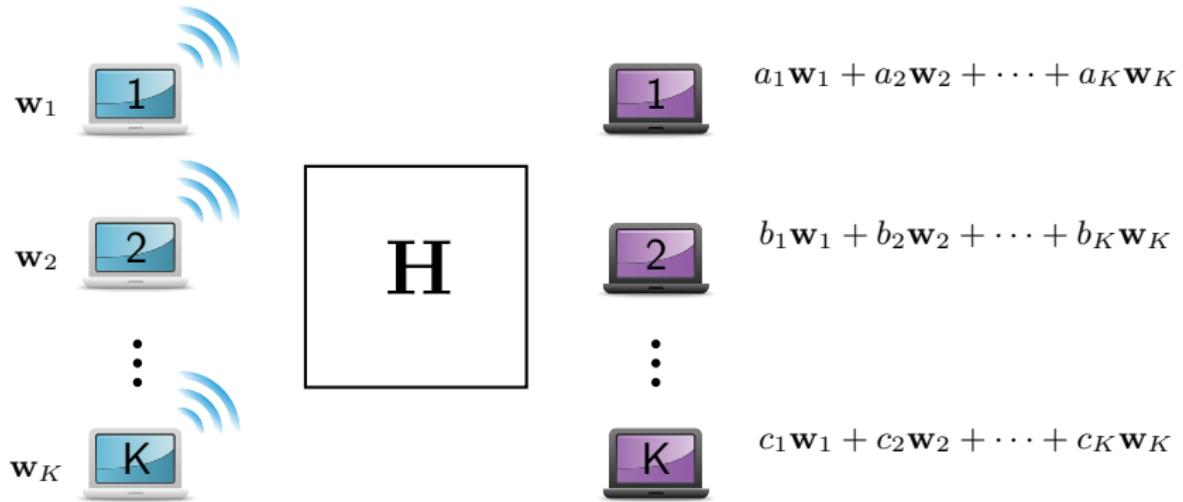
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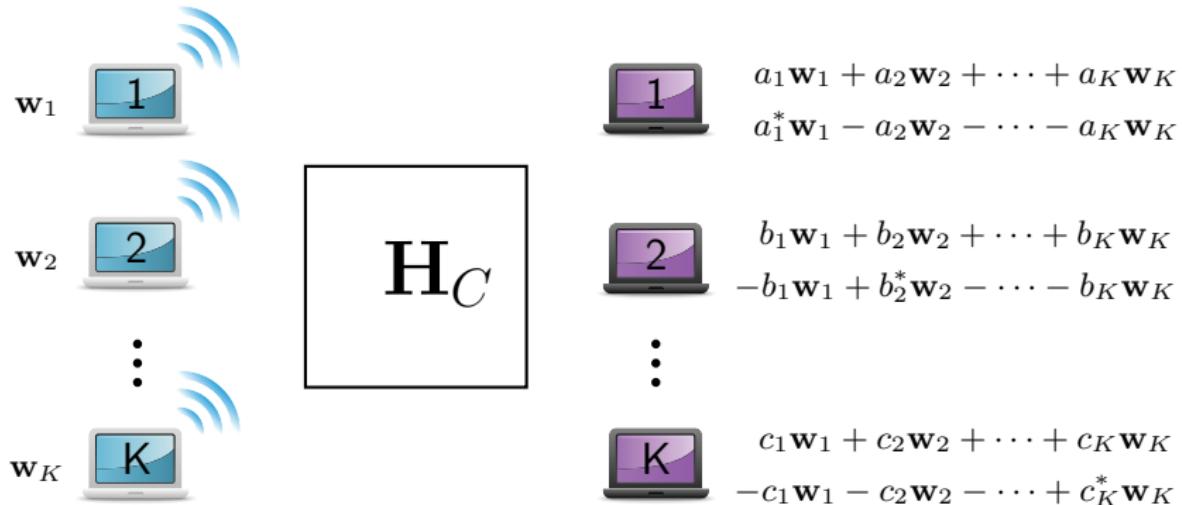
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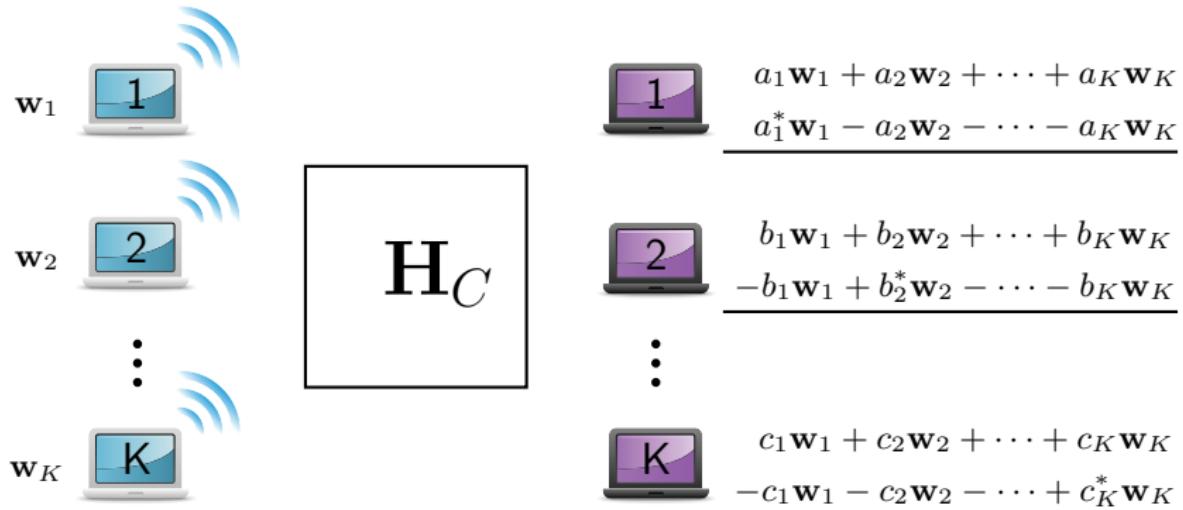
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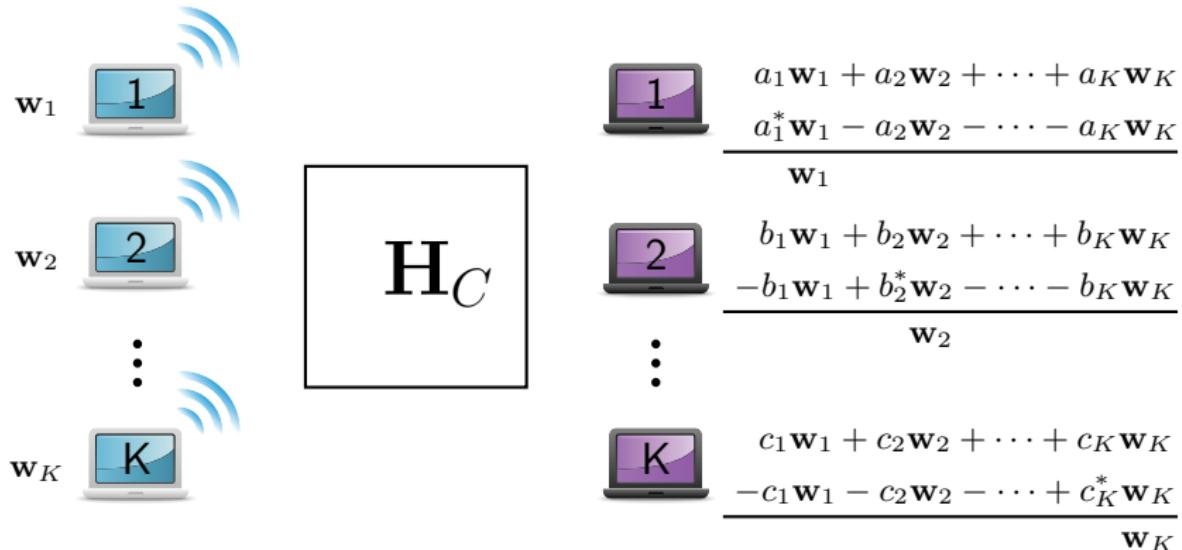
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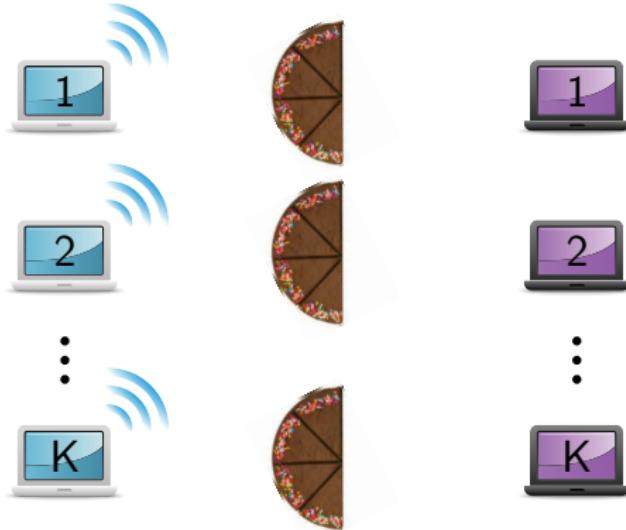
Finite Field IC: Ergodic Capacity Region



- Use computation codes from **Nazer-Gastpar '07**.
- Ergodic capacity region for K -user finite field interference channel:

$$R_\ell + R_k \leq \log_2 q - H(Z), \quad \forall k \neq \ell.$$

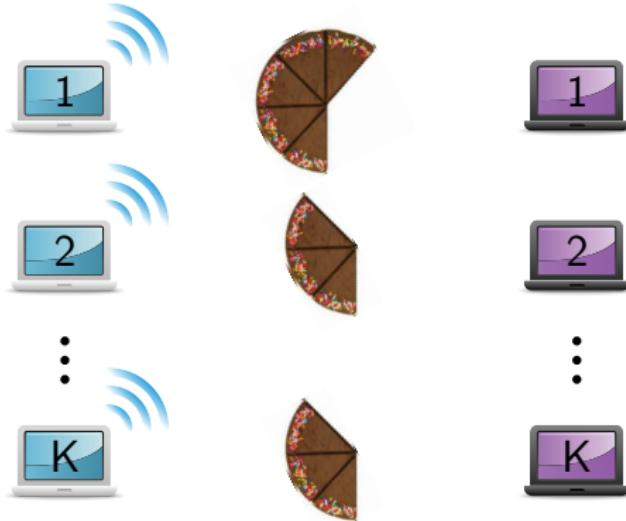
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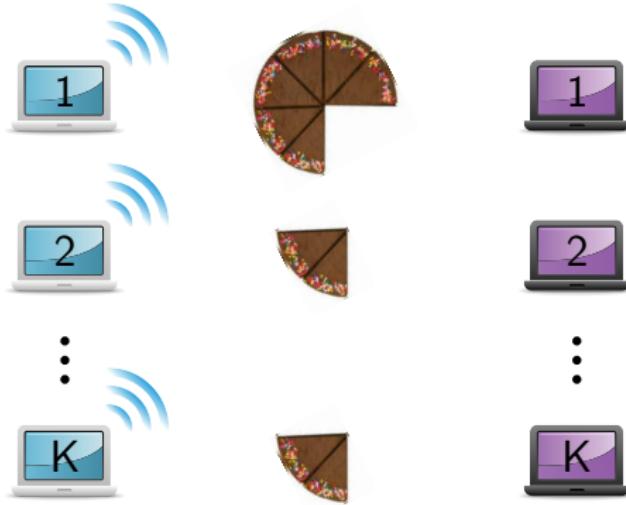
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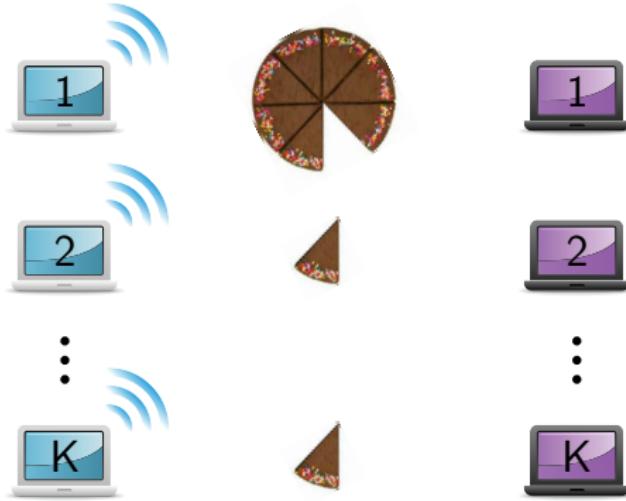
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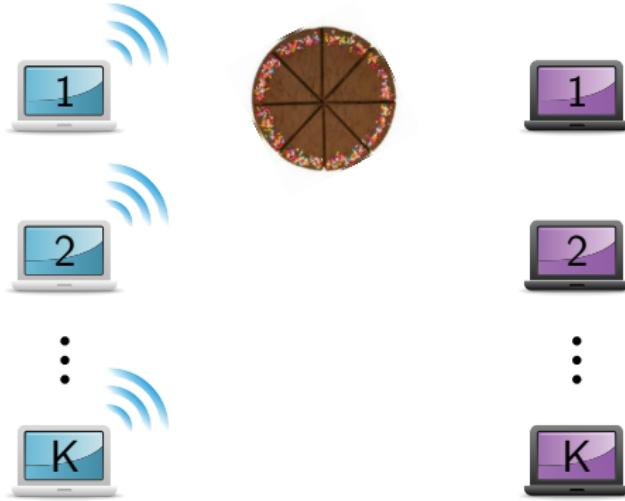
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Related Work

Alignment over Finite Field Multi-Hop Relay Networks (**Jeon-Chung '09**)

Interference Alignment for MIMO X Channels
(**Maddah-Ali - Motahari - Khandani '08**)

Inseparability of Parallel Interference Channels (**Cadambe-Jafar '08,**
Sankar-Shang-Erkip-Poor '08)

Structured Codes for Interference Channels (**Bresler-Parekh-Tse '07,**
Sridharan-Jafarian-Vishwanath-Jafar-Shamai '08)

Conclusions

- Developed a new interference alignment scheme that allows each user to attain **half its interference-free capacity** at any SNR.
- For certain channel models, showed that ergodic interference alignment **achieves the capacity**.