Fundamental Limits of Robust Interference Management

– An Information Theoretic Perspective

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Fundamental Limits

"Noise Barrier" \rightarrow Shannon

"Bandwidth Barrier" \rightarrow MIMO

" 'Interference Barrier" \rightarrow ?

TDMA/FDMA/CDMA, Cellular-reuse patterns, Zero forcing, Dirty Paper Coding, Successive Interference Cancellation, Opportunistic Beamforming, Interference Alignment, Interference Neutralization, Joint Space-Time Precoding, Rate Splitting, Interference Forwarding, Elevated Multiplexing, Improper Signaling



One hop

MISO Broadcast Channel: All messages shared by all Tx.

X Channel: Each Tx has an independent message for each Rx.

Interference Channel: Each Tx has an independent message for its corresponding Rx.





Limitations of DoF



 $DoF = \lim_{P \to \infty} \frac{\text{Network Capacity}}{\text{Link Capacity}} \approx \frac{Network}{\text{th}}$

No. of interference free links that can be created in the network

Unable to capture diversity of channel strength levels. Strong channel \approx Weak channel

Unable to capture diversity of channel knowledge levels.

Finite Precision CSIT \approx No CSIT Perfect CSIT: DoF depend on Channels Rational/Irrational





Bounded Gap Approximations

Generalized Degrees of Freedom (GDoF)

Degrees of Freedom (DoF)

Progressive Refinements Approach



Generalized Degrees of Freedom (GDoF)



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philprostinato

Generalized Degrees of Freedom

[Etkin, Tse, Wang, IT Trans. 2008] (Basis for Deterministic Models of [Avestimehr, Diggavi, Tse, IT Trans. 2011])



$$E|X_i|^2 \leq 1$$
 $G_{ij} = \hat{G}_{ij} + \sqrt{P^{-\beta_{ij}}}\tilde{G}_{ij}$ CSIT: \hat{G} $Z_i \sim \mathcal{N}(0, 1)$ Perfect CSIR

 $G_{\text{DoF}} = \lim_{P \to \infty} \frac{\text{Network Capacity}}{\text{Link Capacity}}$

FAQ: Linear scaling of powers for DoF was understandable. But what does the exponential scaling of powers mean?

(Networks of Capacitated Links)





Network Capacity: C

Network Capacity: C'

$$C' = 2C$$

If we wanted C, but it was somehow easier to find C', then we could find C as C = C'/2.

(Networks of Capacitated Links)





Network Capacity: C

Network Capacity: C'

If we wanted C, but it was somehow easier to find C', then we could find C as $C = C'/\gamma$

Intuition extended to Wireless Networks





Network Capacity: C

Network Capacity: C'

Intuition: $C' \approx \gamma C$

If we wanted C, but it was somehow easier to find C', then we could find C approximately as $C \approx C'/\gamma$

(**Spatial Invariance Conjecture**, Jafar, ITA 2014) Suppose we double the number of antennas at every node (generic channels). Then the network DoF must double as well.

Wireless Network



DoF versus GDoF

DoF metric scales SNR linearly $(C_i \rightarrow C_i + \gamma)$ GDoF scales SNR exponentially $(C_i \rightarrow \gamma C_i)$.

Generalized Degrees of Freedom

 $E|X_i|^2 \le 1$ $G_{ij} = \hat{G}_{ij} + \sqrt{P^{-\beta_{ij}}}\tilde{G}_{ij}$ CSIT: G $Z_i \sim \mathcal{N}(0, 1)$ Perfect CSIR

GDoF =
$$\lim_{P \to \infty} \frac{\text{Network Capacity}}{\text{Link Capacity}}$$

The Next Frontier

GDoF Characterizations under arbitrary levels of channel knowledge, arbitrary levels of channel strengths Some Examples of Robust GDoF Results

- 2 user interference channel with arbitrary α_{ij} , β_{ij}
- 2 user MISO BC with arbitrary α_{ij} , β_{ij}
- *K* user IC: Optimality of treating interference as noise
- Topological Interference Management \equiv Index Coding
- Optimality of TDMA/coloring for Topological Interference Management and Index Coding

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2 User MISO BC

Arbitrary channel strengths and uncertainty levels

[ArXiv 1602.02203, Davoodi, Yuan, Jafar]

$$Y_{1} = \sqrt{P^{\alpha_{11}}}G_{11}X_{1} + \sqrt{P^{\alpha_{12}}}G_{12}X_{2} + Z_{1}$$

$$Y_{2} = \sqrt{P^{\alpha_{21}}}G_{21}X_{1} + \sqrt{P^{\alpha_{22}}}G_{22}X_{2} + Z_{2}$$

$$G_{kl} = \hat{G}_{kl} + \sqrt{P^{-\beta_{kl}}}\tilde{G}_{kl}$$

 $D_{\Sigma} = \min(D_1, D_2)$

- $D_1 = \max(\alpha_{11}, \alpha_{12}) + \max(\alpha_{21} \alpha_{11} + \min(\beta_{11}, \beta_{12}), \alpha_{22} \alpha_{12} + \min(\beta_{11}, \beta_{12}), 0)$
- $D_2 = \max(\alpha_{21}, \alpha_{22}) + \max(\alpha_{11} \alpha_{21} + \min(\beta_{21}, \beta_{22}), \alpha_{12} \alpha_{22} + \min(\beta_{21}, \beta_{22}), 0)$

• Does not depend on strongest CSIT for each receiver.

• Optimal to serve only User 1 iff each Tx antenna prefers User 1 over User 2 by at least β_1 . $\alpha_{11} - \alpha_{21} \ge \beta_1$ and $\alpha_{12} - \alpha_{22} \ge \beta_1$

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TIN Optimality Condition

Direct Characterization of GDoF Region:

Depends only on **max** strengths, even though power optimization is fully involved. (FM elimination of power control variables)

 $\Pi_{\mathcal{K}} = \{ (1, 2), (1, 3), (2, 3), (1, 2, 3), (1, 3, 2) \}$ all possible cycles in the channel

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Yi, Caire, Optimality of treating interference as noise: A combinatorial perspective, TIT 62(8), 2016.

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Given

The topology graph is the complement of the antidote graph Arbitrary Multiple Unicast Message Set (each message has unique source, unique destination)

- 1. Index Coding Capacity Region includes TIM DoF region.
- 2. Equivalent for linear schemes.

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Is TDMA optimal?

Is Fractional Coloring Optimal?

Optimal for every possible multiple **unicast** message set. Optimal for entire DoF/capacity **region**.

Answer for both TIM and Index Coding:

Yes, if and only if network topology graph is chordal bipartite.

https://en.wikipedia.org/wiki/Chordal_graph

Chordal Graphs

Every cycle that can have a chord, must have a chord.

A graph is chordal if
it has no chordless cycles of length ≥ 4.
Network Topology graphs are Bipartite Graphs.
What about bi-partite graphs?

Cycles cannot have odd length.

Cycles of length 4 cannot have chords.

A bipartite graph is **chordal bipartite** if it has no chordless cycles of length \geq 6.

Chordal bipartite.

Chordal bipartite.

TDMA/fractional-coloring **optimal** for **all** message sets.

Not chordal bipartite.

TDMA/fractional-coloring **sub-optimal** for **some** message sets.

Sanity Check

Recall that TDMA is suboptimal. Cannot be Chordal Bipartite. Must have a chordless cycle of length ≥ 6

Applying the Result

Topology Graph is Chordal Bipartite

 \Rightarrow For any unicast message set

- TDMA achieves TIM DoF region.
- Fractional Coloring Achieves Index Coding Capacity Region.

Consider the messages: W_{13} , W_{24} , W_{31} , W_{45} , W_{52} , W_{55} , W_{63} . What is the DoF/Capacity Region? DoF/Capacity Region

Index Coding

Messages: W₁₃, W₂₄, W₃₁, W₄₅, W₅₂, W₅₅, W₆₃

Messages: W₁₃, W₂₄, W₃₁, W₄₅, W₅₂, W₅₅, W₆₃

Index Coding

Messages: W_{13} , W_{24} , W_{31} , W_{45} , W_{52} , W_{55} , W_{63}

Message Conflict Graph

Messages: W_{13} , W_{24} , W_{31} , W_{45} , W_{52} , W_{55} , W_{63}

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Message Conflict Graph

Message Conflict Graph

ТІМ

DoF/Capacity Region

Index Coding

TIM

If the Topology Graph is chordal-bipartite then for any multiple unicast message set the DoF region is achieved by TDMA and is described by the clique inequalities of the message conflict graph.

Index Coding

If the complement of the antidote graph is chordal-bipartite then for any multiple unicast message set the Capacity region is achieved by Fractional Coloring and is described by the clique inequalities of the message conflict graph.

Proof of Converse (Outer Bound)

TIM

Topology Graph

Claim

If Topology Graph \mathcal{G} is chordal bipartite then every clique in Message Conflict Graph induces an Acyclic Demand Graph.

Index Coding

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Message Conflict Graph

Demand Graph

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Index Coding

Antidote Graph

Demand Graph

Proof of Converse (Outer Bound)

TIM

Topology Graph

Claim

If Topology Graph \mathcal{G} is chordal bipartite then every clique in Message Conflict Graph induces an Acyclic Demand Graph.

Index Coding

- $R_{13} + d_{45} + R_{63} \leq 1$
- $R_{45} + R_{55} + R_{63} \leq 1$
- $R_{45} + R_{55} + R_{52} \leq 1$

Clique Inequalities provide Capacity Region Outer Bounds

True for this example. General Proof?

If Topology Graph \mathcal{G} is chordal bipartite then every clique in Message Conflict Graph induces an Acyclic Demand Graph.

Proof by Contradiction:

Suppose a clique in message conflict graph induces a demand graph that has directed cycles.

Choose the shortest such cycle.

It must be a chordless cycle.

(Otherwise the chord creates a shorter directed cycle)

If Topology Graph \mathcal{G} is chordal bipartite then every clique in Message Conflict Graph induces an Acyclic Demand Graph.

Proof by Contradiction:

Suppose a clique in message conflict graph induces a demand graph that has directed cycles.

Choose the shortest such cycle.

It must be a chordless cycle.

A chordless cycle in a demand graph, cannot involve multiple messages from the same source.

Suppose W_1 , W_2 come from the same source.

 W_1 must have an incoming edge from some destination D in the induced cycle.

 W_2 must also have an incoming edge from **same** destination D in the induced cycle.

D has multiple outgoing edges, so the cycle cannot be chordless.

If Topology Graph \mathcal{G} is chordal bipartite then every clique in Message Conflict Graph induces an Acyclic Demand Graph.

Proof by Contradiction:

Suppose a clique in message conflict graph induces a demand graph that has directed cycles.

Choose the shortest such cycle.

It must be a chordless cycle.

A chordless cycle in a demand graph, cannot involve multiple messages from the same source.

Let the length of this chordless cycle be n.

n must be even (because the demand graph is bi-partite).

 $n \neq 2$ because the destination must hear its desired source.

 $n \neq 4$ because then the messages do not conflict. (the messages must conflict because they form a clique in the message conflict graph)

So $n \in \{6, 8, 10, \cdots\}$

If Topology Graph \mathcal{G} is chordal bipartite then every clique in Message Conflict Graph induces an Acyclic Demand Graph.

Proof by Contradiction: (continued)

Chordless cycle in induced demand graph of length $n \in \{6, 8, 10, \cdots\}$

Chordless Cycle in Demand Graph

Implies Chordless Cycle of Length 6 in Topology Graph ${\cal G}$

If Topology Graph \mathcal{G} is chordal bipartite then every clique in Message Conflict Graph induces an Acyclic Demand Graph.

Proof by Contradiction: (continued)

Contradiction!

Chordless Cycle in Demand Graph

Implies Chordless Cycle of Length 6 in Topology Graph \mathcal{G} But \mathcal{G} is chordal bipartite.

Achievability

Whatever we need, in graph theory there is a theorem for that.

Converse

If network topology graph \mathcal{G} is chordal bipartite, then the clique inequalities of the message conflict graph are outer bounds on the capacity region.

Achievability

Why is this outer bound achievable with TDMA?

Message Conflict Graph is \mathcal{G}_e^2 , i.e., the square of the line graph of \mathcal{G}

If \mathcal{G} is chordal bipartite, then it is weakly chordal.

If \mathcal{G} is weakly chordal, then \mathcal{G}_e^2 is also weakly chordal.

Weakly chordal graphs are perfect graphs.

The region described by clique inequalities of perfect graphs has integral vertices

Every vertex of outer bound region is achievable by TDMA.

TDMA achieves the entire DoF region.

Fractional coloring achieves the entire capacity region.

What if Topology Graph is Not Chordal Bipartite? Contains chordless cycle of length ≥ 6

Then there exists a multiple unicast message set for which TDMA is not optimal.

Case 1: n/2 is odd.

TDMA (fractional coloring) can only achieve total DoF (rate) ≤ 1 . Multicast achieves DoF (rate) 3/2. What if Topology Graph is Not Chordal Bipartite?

Then there exists a multiple unicast message set for which TDMA is not optimal.

Topology Graph (Not Chordal Bipartite)

TDMA (fractional coloring) can only achieve total DoF (rate) ≤ 2 . Interference Alignment achieves DoF (rate) = 8/3 [Jafar, IT Trans 2014]

What if Topology Graph is Not Chordal Bipartite?

Then there exists a multiple unicast message set for which TDMA is not optimal.

 \mathbf{v}_1 , \mathbf{v}_2 , \mathbf{v}_3 , \mathbf{v}_4 are 3 \times 1 vectors. Any \mathbf{v}_i , \mathbf{v}_j , \mathbf{v}_k are linearly independent.

Align interference to D_i along \mathbf{v}_i .

8 symbols sent over 3 channel uses.

Interference Alignment achieves 8/3 DoF.

(Equiv. IA achieves rate 8/3 for Index Coding) (Incidentally, 8/3 is optimal.) TDMA (fractional coloring) is not optimal.

Conclusion

GDoF

Fundamental limits Robust insights Vast scope Challenging Not always beyond reach