

On Multi-source Multi-sink Hyperedge Networks: Enumeration, Rate Region Computation, & Hierarchy

Congduan Li

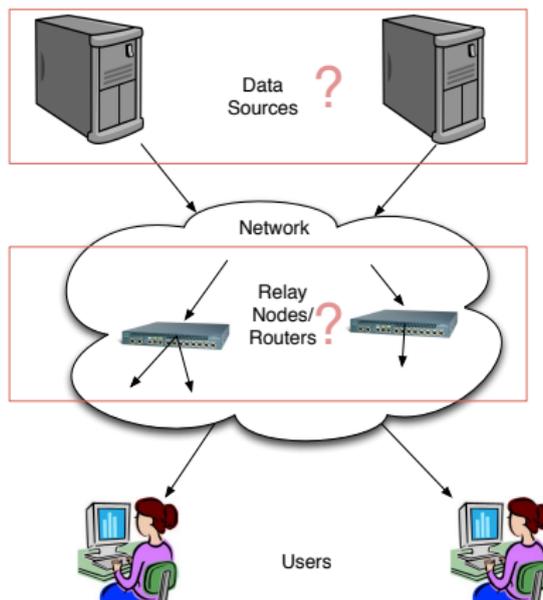
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Joint work with Steven Weber and John Walsh

Jun 15, 2016

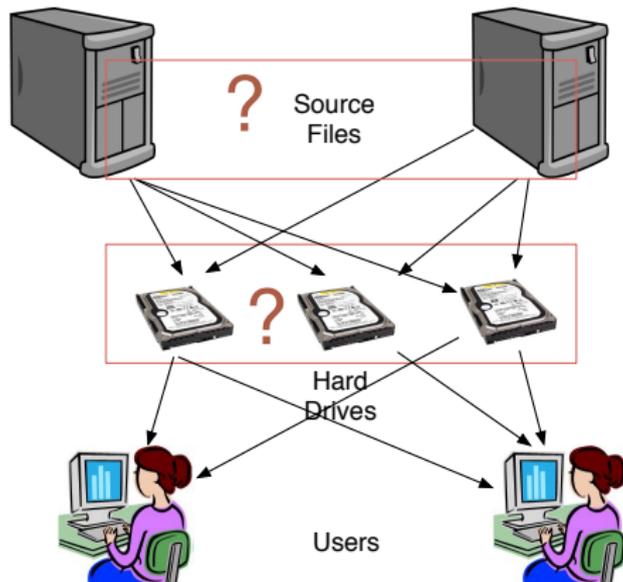
Motivation: information flow in networks

- Coding (mix the input) outperforms routing (receive-forward) in many circumstances
- Efficient information flow in networks: admissible source rate v.s channel capacities



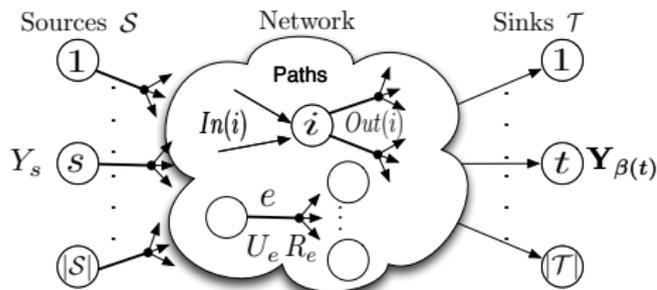
Motivation: information storage in data centers

- Coding (mix sources) saves resources, compared with simple replication
- Efficient information storage in data centers: admissible source file size v.s hard disk capacities



Generalized model

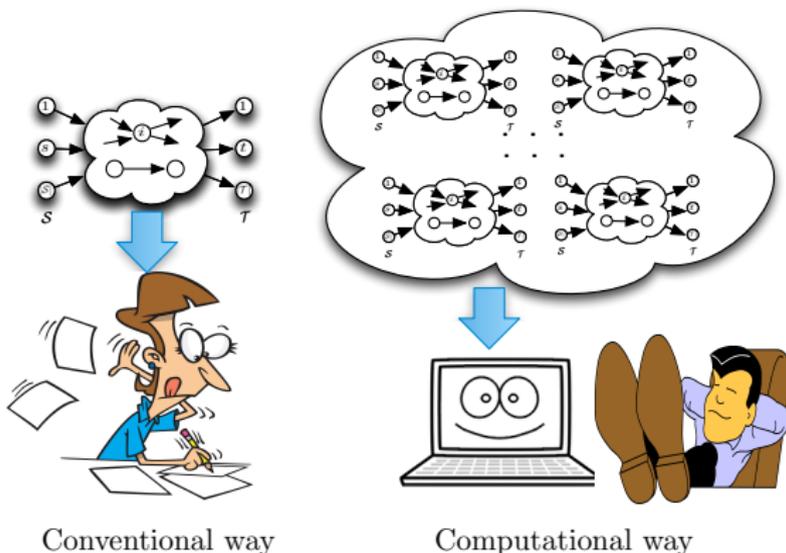
A multisource multisink hyperedge network (hyperedge MSNC)



- Rate/capacity region: compute
- Notation: $(K, |\mathcal{E}_U|)$ means K sources, $|\mathcal{E}_U|$ intermediate hyperedges
- We made three major contributions

Contribution 1: Revolution, use computer for rate region calculation

- Conventional: 1 (special) network, info. ineq., manually, 1 paper
- Computational: $10^3, 10^6, 10^{12}$ (arbitrary) networks, computer, # of papers?

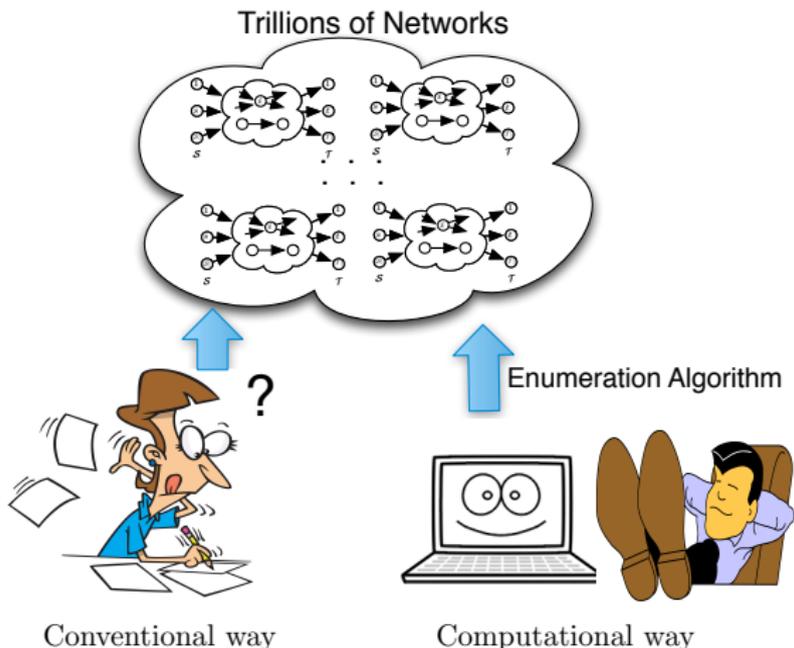


Conventional way

Computational way

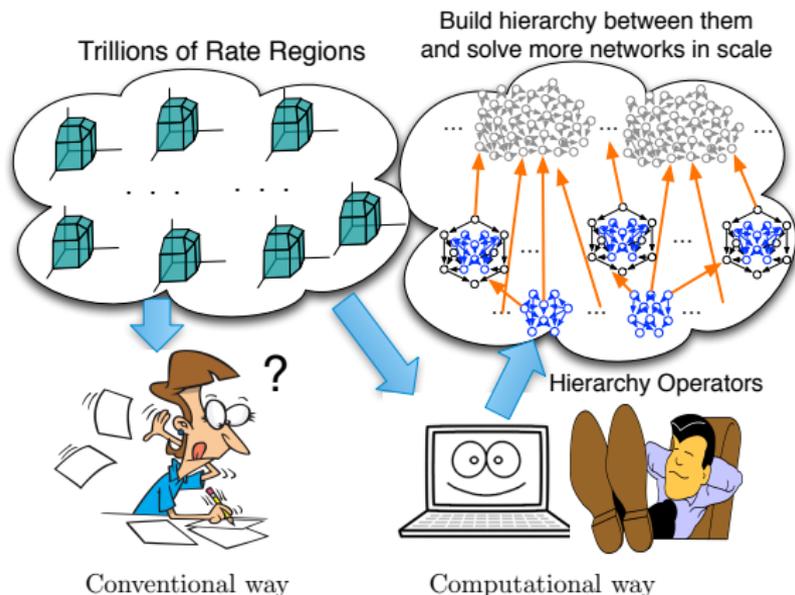
Contribution 2: enumeration of all networks

- Conventional: almost impossible to list all networks due to the large number of instances
- Computational: enumerate $\geq 10^9, 10^{12}$ general networks



Contribution 3: build hierarchy between networks

- Conventional: what to do with so many rate regions?
- Computational: define embedding and combination operators, build a hierarchy, analyze the rate regions and use them to solve even more networks in scale



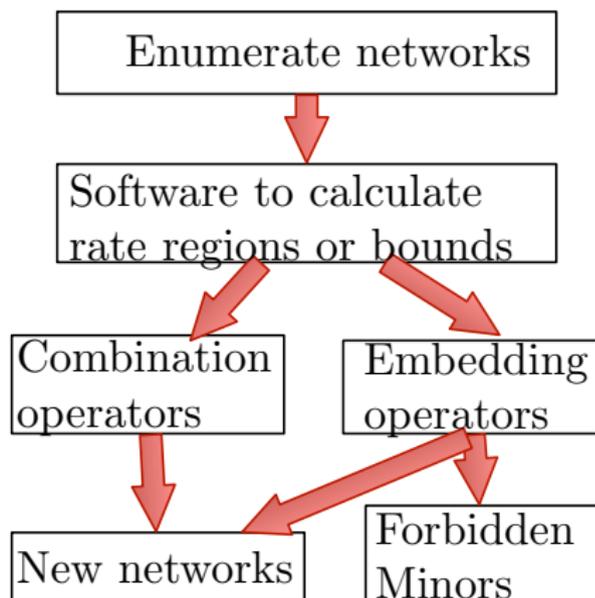
1 Enumeration

- Network Model
- Minimality
- Network Equivalence Class
- Enumeration algorithm

2 Rate Region Computation

3 Network Operations

- Embedding Operations
- Combination Operations
- Play with both



Outline

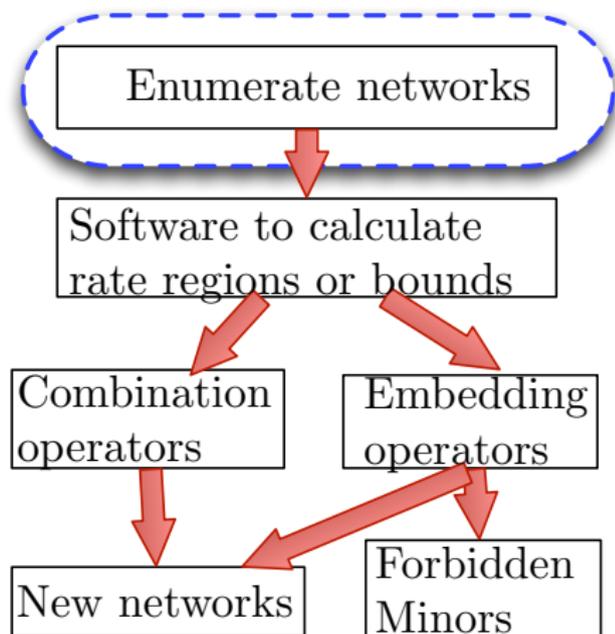
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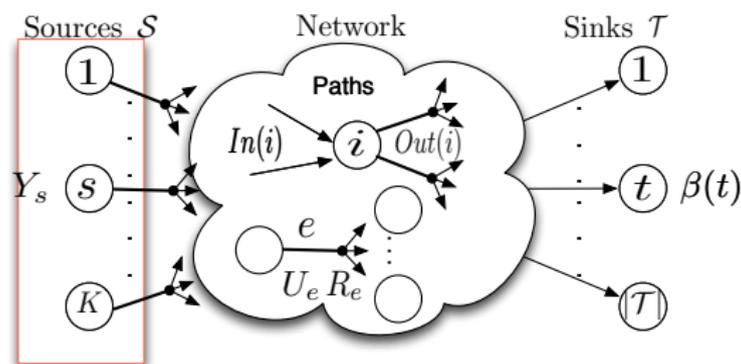
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Network Coding: Sources

We assume $U_{\text{Out}(s)} = Y_s$



Source Rate

$$H(Y_s) \geq \omega_s$$

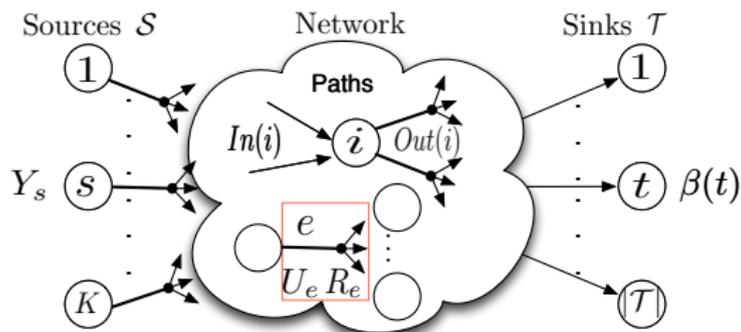
Source Independence

$$H(Y_S) = \sum_{s \in S} H(Y_s)$$

Source Encoding

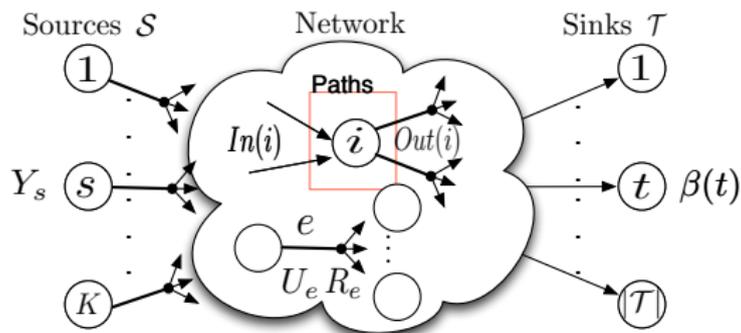
$$H(U_{\text{Out}(s)} | Y_s) = 0$$

Network Coding: Edges



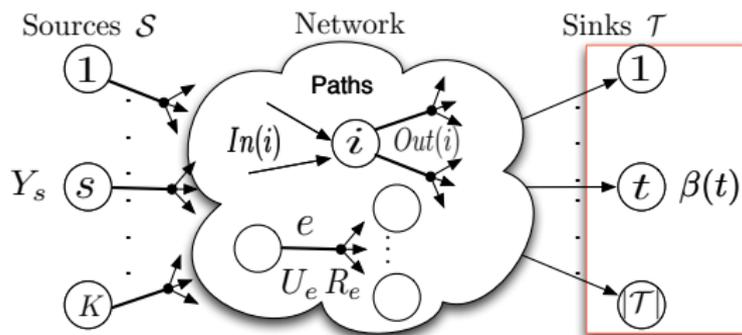
Coding Rate $R_e \geq H(U_e), e \in \mathcal{E}$

Network Coding: Nodes



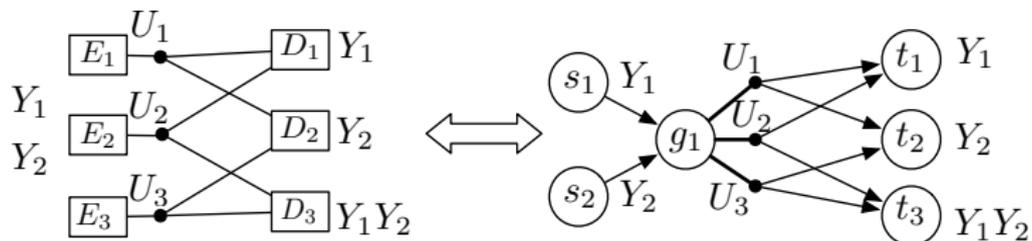
Coding Constraints $H(U_{Out(i)}|U_{In(i)}) = 0, i \in \mathcal{V} \setminus (\mathcal{S} \cup \mathcal{T})$

Network Coding: Sinks



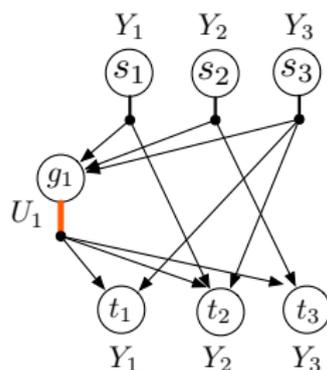
Decoding Constraints $H(Y_{\beta(t)}|U_{In(t)}) = 0, t \in \mathcal{T}$

Special Case: Independent Distributed Source Coding (IDSC)



- Sources available to all encoders
- Decoders demand various subsets of sources
- When sources are prioritized, it becomes MDCS

Special Case: Index Coding



- Only one intermediate edge that transmits all information of sources
- Sources may be directly available at sinks as side information
- $(K, 1)$ hyperedge MSNC

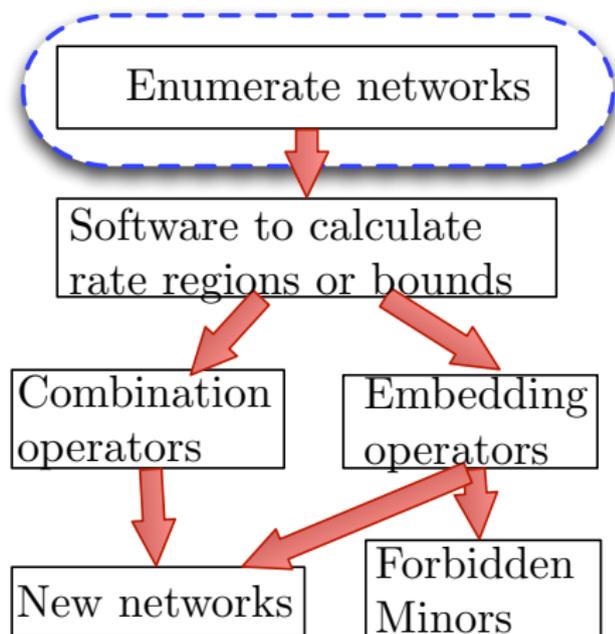
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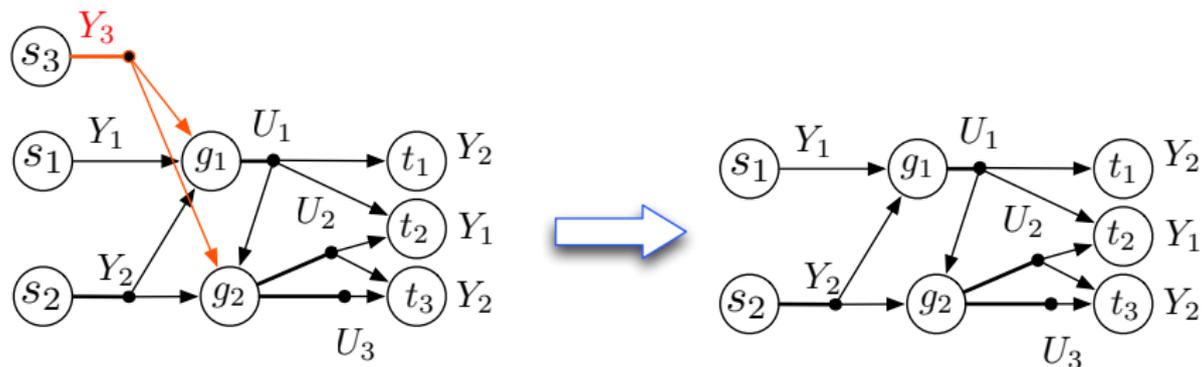
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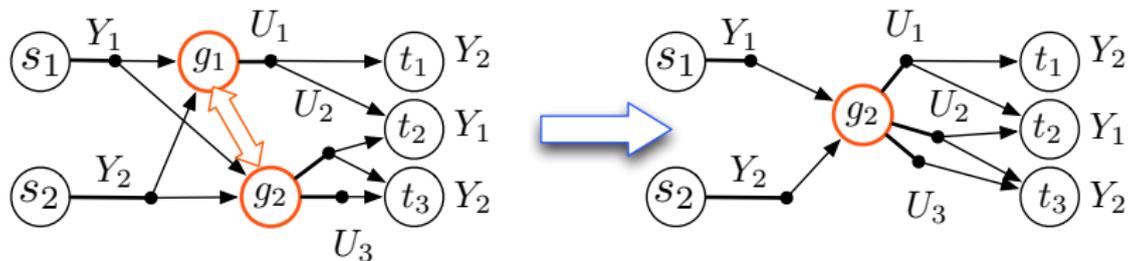
Source minimality example

Source minimality example: Redundant source s_3 is not demanded by any sink.



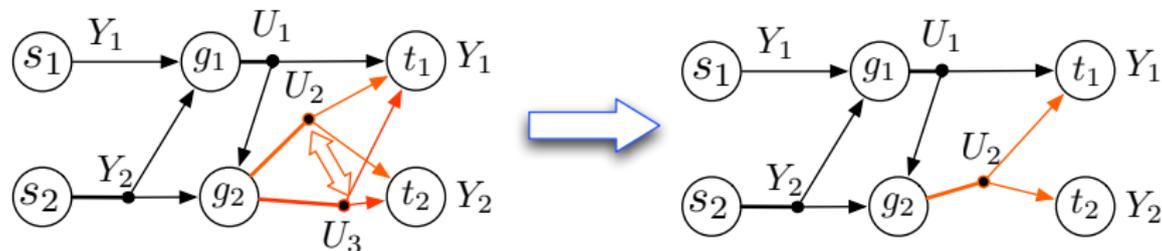
Node minimality example

Node minimality example: g_1, g_2 can be merged due to same input



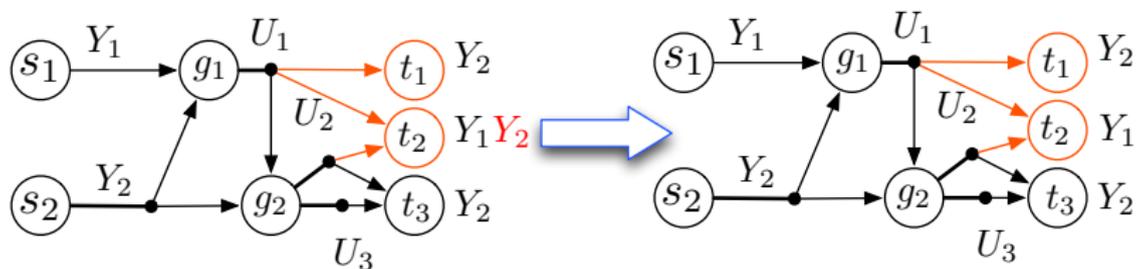
Edge minimality example

Edge minimality example: U_2, U_3 are parallel and can be merged



Sink minimality example

Sink minimality example: decoding ability of Y_2 at t_2 implied by t_1 , equivalent to let t_2 demand Y_1 only



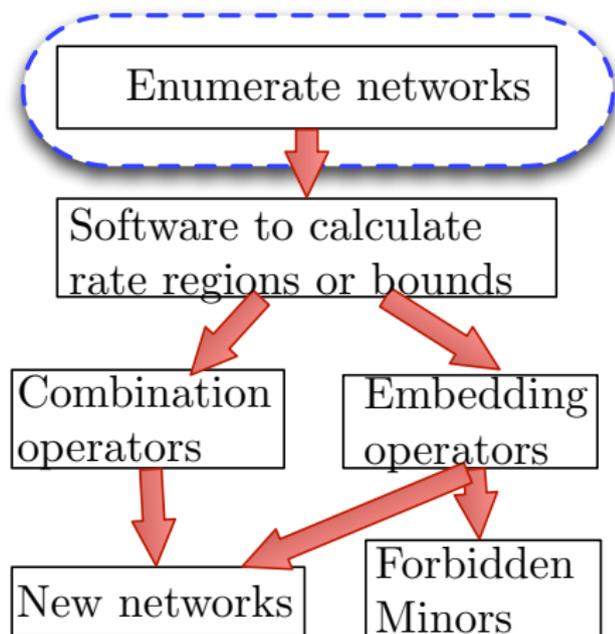
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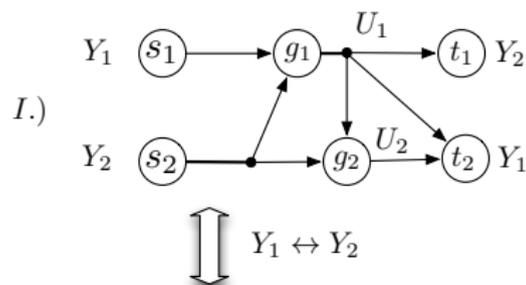
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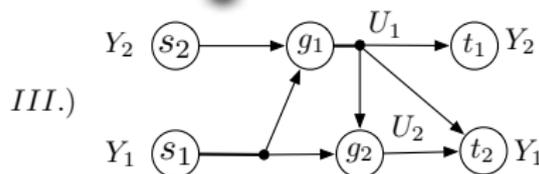
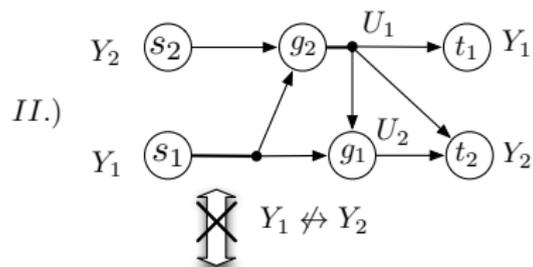
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Equivalent Networks

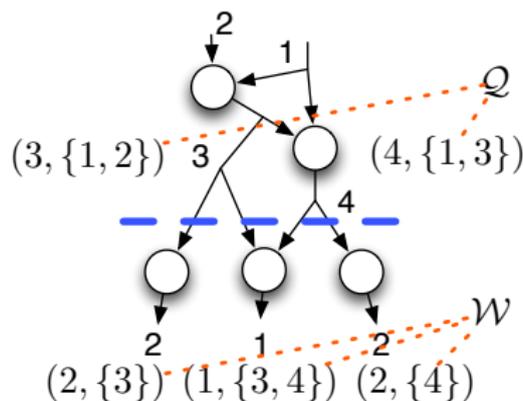


- *I*, *II* are equivalent: permute sources and edges
- *I*, *III* are not equivalent: sources are only permuted at source side
- *II*, *III* are not equivalent: sources are only permuted at sink side



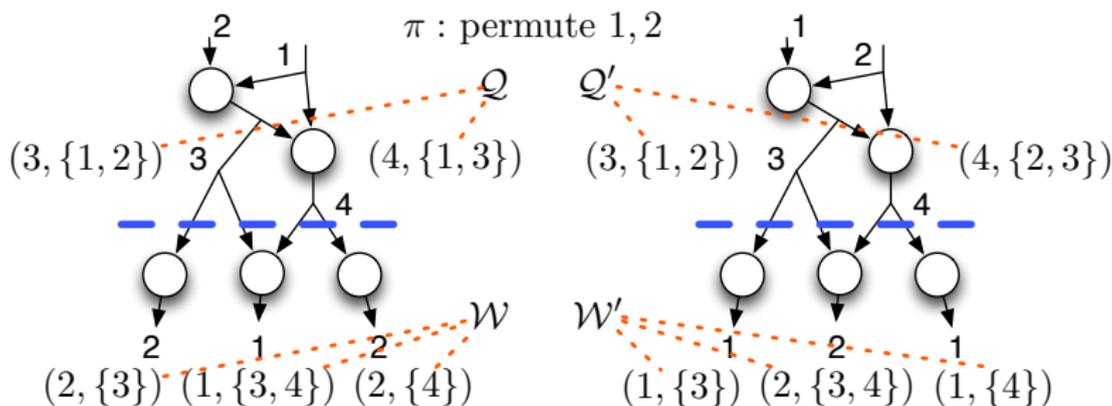
Representing a Network

- Ordered pair (Q, \mathcal{W}) , sources $1 \dots K$, edges $K + 1, \dots, K + |\mathcal{E}_U|$;
- Edge definitions $Q \subseteq \{(i, \mathcal{A}) | i \in \{K + 1, \dots, K + |\mathcal{E}_U|\}, \mathcal{A} \subseteq \{1, \dots, K + |\mathcal{E}_U|\} \setminus \{i\}\}$;
- Sink definitions $\mathcal{W} \subseteq \{(i, \mathcal{A}) | i \in \{1, \dots, K\}, \mathcal{A} \subseteq \{1, \dots, K + |\mathcal{E}_U|\} \setminus \{i\}\}$;
- Same i allowed to appear in \mathcal{W} but not in Q



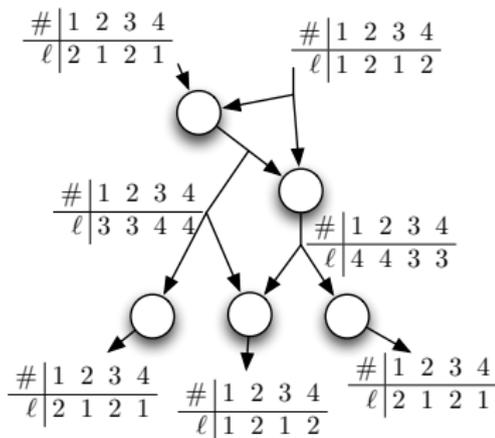
Equivalence Under Group Action

- Symmetry group $\mathbf{G} := S_{\{1,2,\dots,K\}} \times S_{\{K+1,\dots,K+|\mathcal{E}_U\}};$
- $\pi \in \mathbf{G}$, then $\pi(Q) \mapsto \{\pi((i, \mathcal{A})) \mid (i, \mathcal{A}) \in Q\};$
- $\pi((Q, \mathcal{W})) = (\pi(Q), \pi(\mathcal{W}));$
- Isomorphic or Equivalent: $\exists \pi \in \mathbf{G}$ such that $\pi((Q_1, \mathcal{W}_1)) = (Q_2, \mathcal{W}_2).$



Canonical Network: minimal representative in each orbit

- Orbit: $\mathcal{O}_{(\mathcal{Q}, \mathcal{W})} := \{(\pi(\mathcal{Q}), \pi(\mathcal{W})) \mid \pi \in \mathbf{G}\}$
- Networks in an orbit are isomorphic or equivalent to each other
- Transversal: one representative for each orbit, the canonical one
- Lexicographically order the pairs (i, \mathcal{A}) according to $(i, \mathcal{A}) > (j, \mathcal{A}')$ if $j < i$ or $i = j, \mathcal{A}' < \mathcal{A}$ under the lexicographic ordering
- Canonical: apply order to $(\mathcal{Q}, \mathcal{W})$ and get the minimal one



1 is the canonical representative

#	\mathcal{Q}	\mathcal{W}
1	$\{(3, \{1, 2\}), (4, \{1, 3\})\}$	$\{(1, \{3, 4\}), (2, \{3\}), (2, \{4\})\}$
2	$\{(3, \{1, 2\}), (4, \{2, 3\})\}$	$\{(1, \{3\}), (1, \{4\}), (2, \{3, 4\})\}$
3	$\{(3, \{1, 4\}), (4, \{1, 2\})\}$	$\{(1, \{3, 4\}), (2, \{3\}), (2, \{4\})\}$
4	$\{(3, \{2, 4\}), (4, \{1, 2\})\}$	$\{(1, \{3\}), (1, \{4\}), (2, \{3, 4\})\}$

Why this representation

- Some minimality constraints easily to take care, e.g., repeated edges, redundant nodes, etc
- Smaller orbits, compared with node representation
- Orbit-stabilizer theorem: $|\mathcal{O}_{(Q,W)}| = \frac{|G|}{|Stab((Q,W))|}$

$\frac{\#}{\ell} \begin{array}{c|c} 1 & 2 \\ \hline 2 & 1 \end{array}$

$\frac{\#}{\ell} \begin{array}{c|c} 1 & 2 \\ \hline 3 & 3 \end{array}$

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Subgroup of $\mathcal{S}_{\{a,b\}} \times \mathcal{S}_{\{c,d,e,f\}}$
stabilizing $(\mathcal{V}, \mathcal{E}) = \mathcal{S}_{\{d,f\}}$

#	a	b	c	d	e	f
1	2	1	3	4	5	6
2	1	2	3	4	5	6
3	2	1	4	5	6	3
⋮						
⋮						
24	1	2	3	4	6	5

#	\mathcal{Q}	\mathcal{W}
1	$\{(3, \{1, 2\}), (4, \{1, 2\})\}$	$\{(1, \{3, 4\}), (2, \{3\}), (2, \{4\})\}$
2	$\{(3, \{1, 2\}), (4, \{1, 2\})\}$	$\{(1, \{3\}), (1, \{4\}), (2, \{3, 4\})\}$

Subgroup of $\mathcal{S}_{\{1,2\}} \times \mathcal{S}_{\{3,4\}}$ stabilizing $(\mathcal{G}, \mathcal{T}) = \mathcal{S}_{\{3,4\}}$

Isomorphs in Node Representation (24)

Isomorphs in Edge and Sink Definition Representation (2)

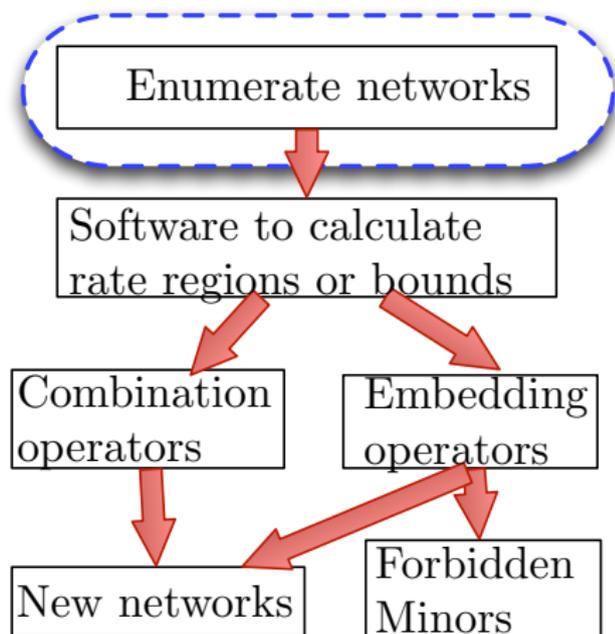
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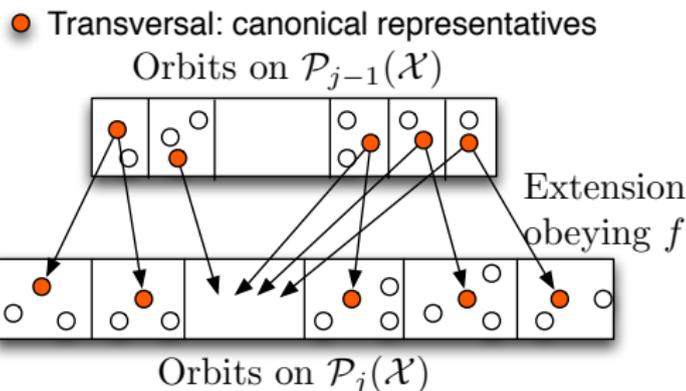
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Leiterspiel Algorithm [BettenBraunFripertinger, 2006]

- Computes transversal of orbits on size j subsets $\mathcal{P}_j(\mathcal{X})$ of set \mathcal{X} , incrementally in j ; also gives symmetry group (stabilizer)
- Lists directly the canonical representatives satisfying some test function f , as long as this test has the inherited property, i.e., if a superset satisfies, its subsets also satisfy
- Input: set \mathcal{X} , group G , inherited test function f
- Output: transversal of subsets of different sizes until stop, either fixed j or other stop conditions, symmetry group (stabilizer)



Enumeration based on Leiterspiel Algorithm

- Target: $(K, |\mathcal{E}_U|)$ non-isomorphic networks
- Recall representation of networks: $(\mathcal{Q}, \mathcal{W})$, list pool for \mathcal{Q} first
- Leiterspiel defines edges incrementally from 1 to $|\mathcal{E}_U|$

$$\mathcal{X} := \{(i, \mathcal{A}) \mid i \in \{K+1, \dots, K+|\mathcal{E}_U|\}, \mathcal{A} \subseteq \{1, \dots, K+|\mathcal{E}_U|\} \setminus \{i\}\}$$

$$\text{Acting group } G := S_{\{1, \dots, K\}} \times S_{\{K+1, \dots, K+|\mathcal{E}_U|\}}$$

With some minimality constraints inherited

$$\text{Call Leiterspiel } T_{|\mathcal{E}_U|} = \text{Leiterspiel}(G, \mathcal{P}_{|\mathcal{E}_U|}^f(\mathcal{X}))$$

Stop condition: reach number of edges

Enumeration based on Leiterspiel Algorithm

- Now for each $Q \in T_{|\mathcal{E}_U|}$, list possible \mathcal{W}
- Leiterspiel incrementally adds sinks from 1 to no possible new sink

$\mathcal{Y} := \{(i, \mathcal{A}) \mid \exists \text{ a directed path in } Q \text{ from } i \text{ to at least one edge in } \mathcal{A}\}$

Acting group $G := S_{\{1, \dots, K\}} \times S_{\{K+1, \dots, K+|\mathcal{E}_U\}}$

With some minimality constraints inherited

Call Leiterspiel $T_{|\mathcal{T}|} = \text{Leiterspiel}(G, \mathcal{P}_{|\mathcal{T}|}^f(\mathcal{Y}))$

Stop condition: cannot increase j obeying f

For each $\mathcal{W} \in \{T_1, \dots, T_{|\mathcal{T}|}\}$, test all the other minimality conditions on (Q, \mathcal{W}) , if it passes, we obtain a non-isomorphic network instance

Enumeration Results

$|\mathcal{M}|$: number of non-isomorphic networks, listed;

$|\hat{\mathcal{M}}|$: number of networks with edge isomorphism, counted;

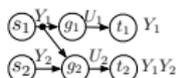
$|\hat{\mathcal{M}}_n|$: number of networks with node isomorphism, counted;

(K, \mathcal{E}_U)	(1,2)	(1,3)	(2,1)	(2,2)	(2,3)	(3,1)	(3,2)
$ \mathcal{M} $	4	132	1	333	485 890	9	239 187
$ \hat{\mathcal{M}} $	7	749	1	1 270	5 787 074	31	2 829 932
$ \hat{\mathcal{M}}_n $	39	18,401	6	$\geq 10^5$	$\geq 10^{12}$	582	$\geq \times 10^{11}$

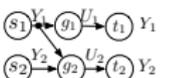
All (2, 2) networks: no direct access btw sources & sinks



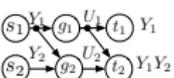
Instance #1



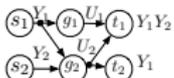
Instance #2



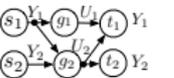
Instance #3



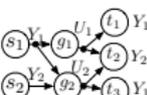
Instance #4



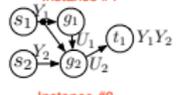
Instance #5



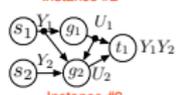
Instance #6



Instance #7



Instance #8



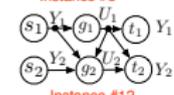
Instance #9



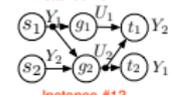
Instance #10



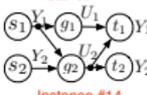
Instance #11



Instance #12



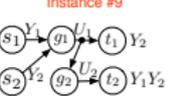
Instance #13



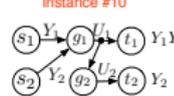
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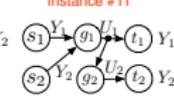
Instance #15



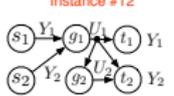
Instance #16



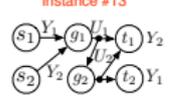
Instance #17



Instance #18



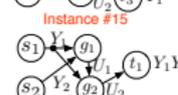
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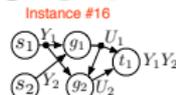
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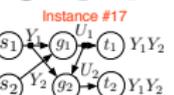
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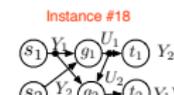
Instance #22



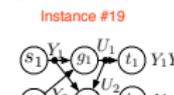
Instance #23



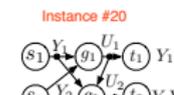
Instance #24



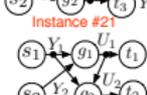
Instance #25



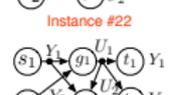
Instance #26



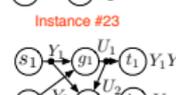
Instance #27



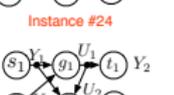
Instance #28



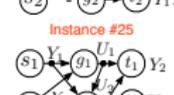
Instance #29



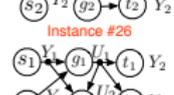
Instance #30



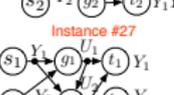
Instance #31



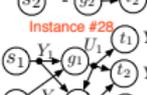
Instance #32



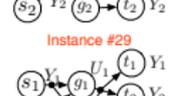
Instance #33



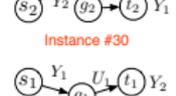
Instance #34



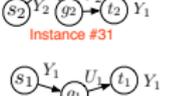
Instance #35



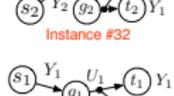
Instance #36



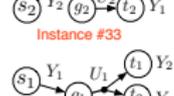
Instance #37



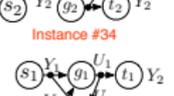
Instance #38



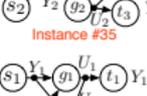
Instance #39



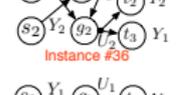
Instance #40



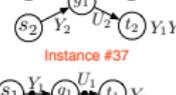
Instance #41



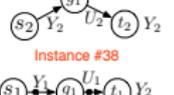
Instance #42



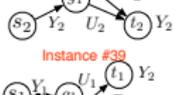
Instance #43



Instance #44



Instance #45



Instance #46

Outline

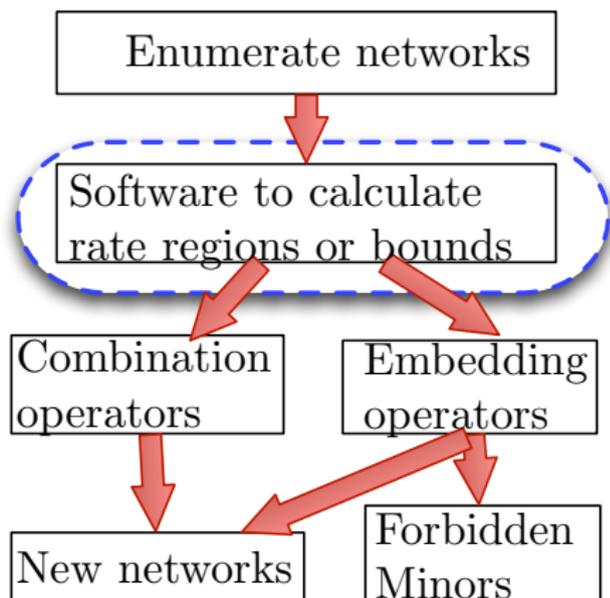
1 Enumeration

- Network Model
- Minimality
- Network Equivalence Class
- Enumeration algorithm

2 Rate Region Computation

3 Network Operations

- Embedding Operations
- Combination Operations
- Play with both



- Rate region: all possible rate and source entropy vectors satisfying all network constraints.
- Collect the N network random variables and their joint entropies.
- Define Γ_N^* : $2^N - 1$ -dim., region of valid entropy vectors. (revisit later)
- Constraints from network A:

$$\mathcal{L}_1 = \{\mathbf{h} \in \Gamma_N^* : h_{Y_S} = \sum_{s \in \mathcal{S}} h_{Y_s}\} \quad (1)$$

$$\mathcal{L}_2 = \{\mathbf{h} \in \Gamma_N^* : h_{X_{\text{Out}(k)}|Y_s} = 0\} \quad (2)$$

$$\mathcal{L}_3 = \{\mathbf{h} \in \Gamma_N^* : h_{X_{\text{Out}(i)}|X_{\text{In}(i)}} = 0\} \quad (3)$$

$$\mathcal{L}_4 = \{(\mathbf{h}^T, \mathbf{R}^T)^T \in \mathbb{R}_+^{2^N - 1 + |\mathcal{E}|} : R_e \geq h_{U_e}, e \in \mathcal{E}\} \quad (4)$$

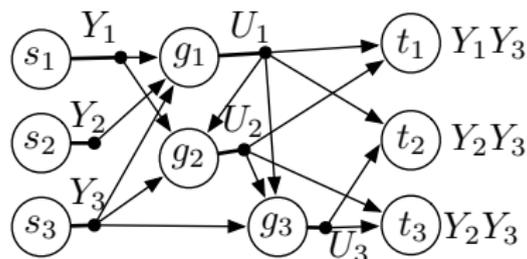
$$\mathcal{L}_5 = \{\mathbf{h} \in \Gamma_N^* : h_{Y_{\beta(t)}|U_{\text{In}(t)}} = 0\}. \quad (5)$$

- Rate region (cone) in terms of edge rates and source entropies (derived from [Yan, Yeung, Zhang TranIT 2012]):

$$\mathcal{R}_*(\mathbf{A}) = \text{proj}_{R_{\mathcal{E}}, H(Y_S)}(\overline{\text{con}(\Gamma_N^* \cap \mathcal{L}_{123})} \cap \mathcal{L}_{45}) \quad (6)$$

Rate Region Example

- A (3, 3) network and its rate region $\mathcal{R}_*(A)$
- Rate region: a cone with dimensions of all variables in the network



$$\begin{aligned}
 R_1 &\geq H(Y_2) \\
 R_1 + R_3 &\geq H(Y_2) + H(Y_3) \\
 R_2 + R_3 &\geq H(Y_2) + H(Y_3) \\
 R_1 + R_2 &\geq H(Y_1) + H(Y_2) + H(Y_3) \\
 R_1 + R_2 + 2R_3 &\geq H(Y_1) + 2H(Y_2) + 2H(Y_3)
 \end{aligned}$$

- Rate region: a cone in terms of edge rates and source entropies:

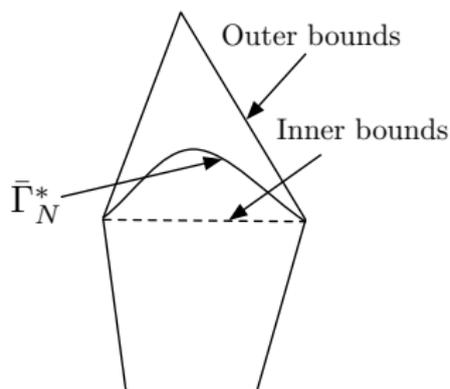
$$\mathcal{R}_*(\mathbf{A}) = \text{proj}_{R_{\mathcal{E}}, H(Y_S)}(\overline{\text{con}(\Gamma_N^* \cap \mathcal{L}_{123})} \cap \mathcal{L}_{45}) \quad (7)$$

- Involves Γ_N^* : $2^N - 1$ -dim., region of valid entropy vectors.

Region of Entropic Vectors

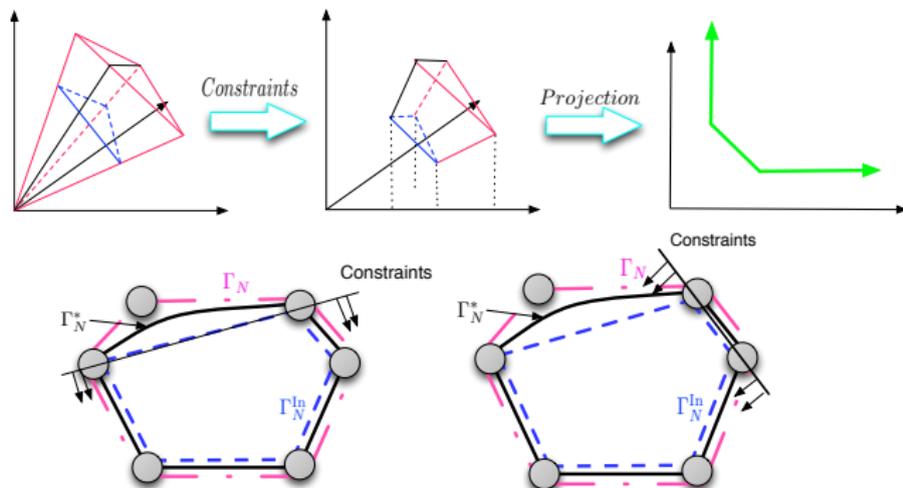
Γ_N^* :

- Open in general
- $\bar{\Gamma}_N^*$ not fully characterized for $N \geq 4$: convex but contains non-polyhedral part



Sandwich Bounds

- $\bar{\Gamma}_N^* \rightarrow \Gamma_N^{Out}$: $\mathcal{R}_{out}(A) = \text{proj}_{R_{\mathcal{E}}, H(Y_S)}(\Gamma_N^{Out} \cap \mathcal{L}_{12345})$
- $\bar{\Gamma}_N^* \rightarrow \Gamma_N^{In}$: $\mathcal{R}_{in}(A) = \text{proj}_{R_{\mathcal{E}}, H(Y_S)}(\Gamma_N^{In} \cap \mathcal{L}_{12345})$
- $\mathcal{R}_*(A) = \mathcal{R}_{out}(A) = \mathcal{R}_{in}(A)$, if $\mathcal{R}_{out}(A) = \mathcal{R}_{in}(A)$
- It becomes: Initial polyhedra $\rightarrow \cap$ constraints \rightarrow projections
- Our work following this idea: Li, *et. al*, Allerton 2012, NetCod 2013, submission TransIT 2014.

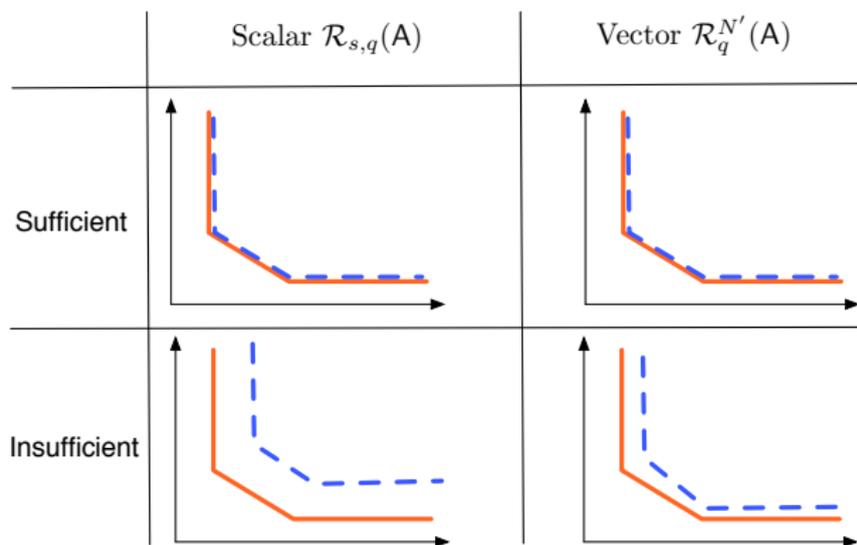


Notion of sufficiency

- Outer bound typically used is Shannon outer bound $\rightarrow \mathcal{R}_o(A)$; inner bounds from representable matroids: scalar and vector bounds.

- Scalar sufficiency: $\mathcal{R}_*(A) = \mathcal{R}_{s,q}(A)$

- Vector sufficiency: $\mathcal{R}_*(A) = \mathcal{R}_q^{N'}(A)$



Rate Region Computation Results

$|\mathcal{M}|$: number of all network instances;

The other numbers represent the numbers of instances we can close the gap using various bounds, and hence exact rate region can be obtained

(K, \mathcal{E})	$ \mathcal{M} $	$\mathcal{R}_{s,2}(A)$	$\mathcal{R}_2^{N+1}(A)$	$\mathcal{R}_2^{N+2}(A)$	$\mathcal{R}_2^{N+4}(A)$
(1, 2)	4	4	4	4	4
(1, 3)	132	122	132	132	132
(2, 1)	1	1	1	1	1
(2, 2)	333	301	319	323	333
(2, 3)	485890	341406	403883	432872	–
(3, 1)	9	4	4	9	9
(3, 2)	239187	118133	168761	202130	–

Outline

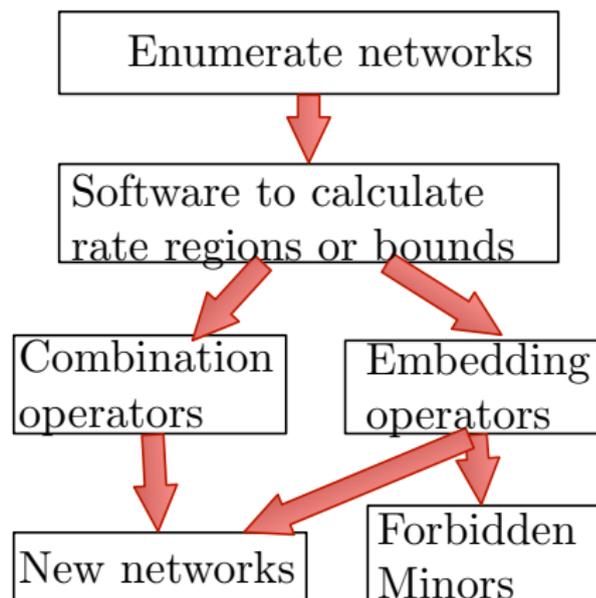
1 Enumeration

- Network Model
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- Enumeration algorithm

2 Rate Region Computation

3 Network Operations

- Embedding Operations
- Combination Operations
- Play with both



Outline

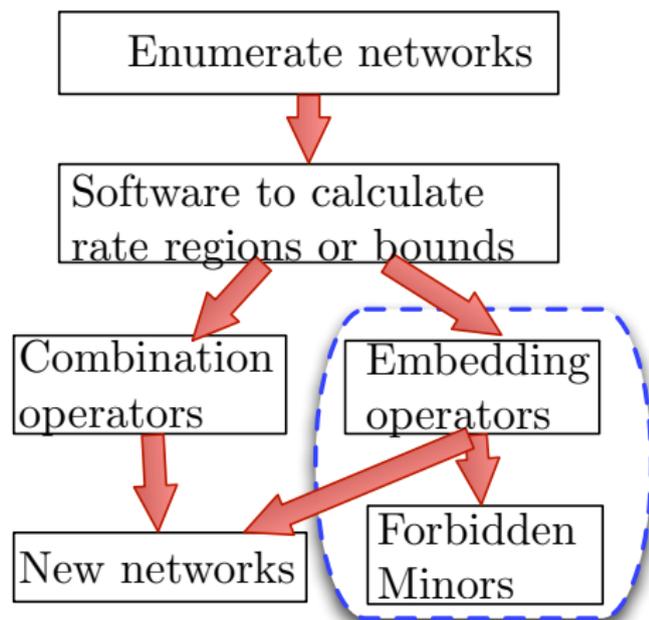
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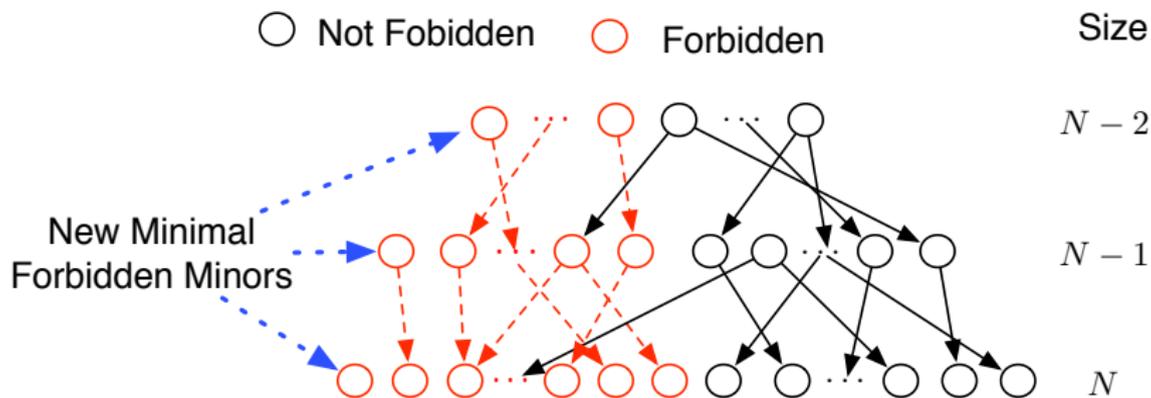
3 Network Operations

- Embedding Operations
- Combination Operations
- Play with both



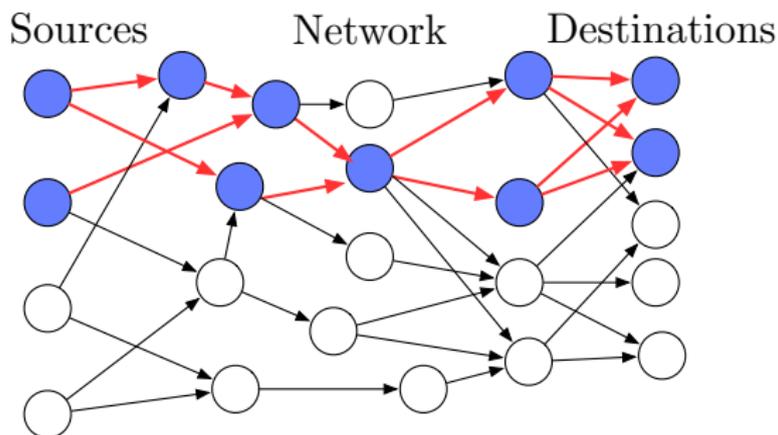
Motivated from graph and matroid theory

- Inheritance property regarding sufficiency of class of codes
- Minor-closed graphs: finite number of forbidden minors [RobertsonSeymour1983-2004]
- Rota's conjecture in matroid theory: finite number of forbidden minors for \mathbb{F}_q representability [Oxley2011]



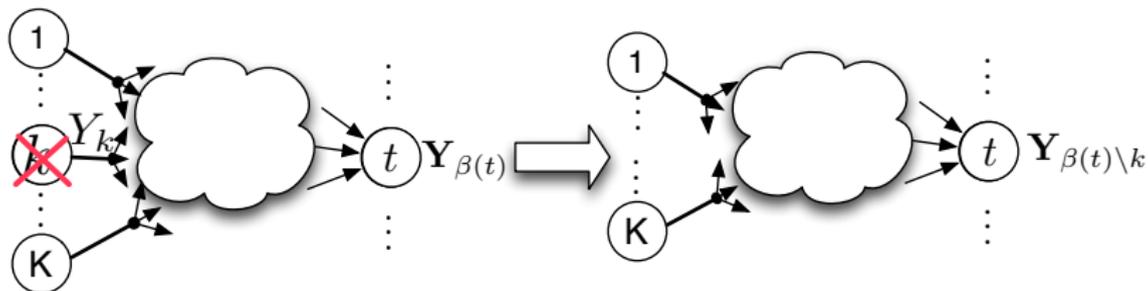
Similar characterization for networks?

- If networks have similar characterization? Possible list of forbidden embedded networks for sufficiency of linear codes over a field.
- Network operations to obtain such embedded networks preserving insufficiency, & region relationships
- Three operations



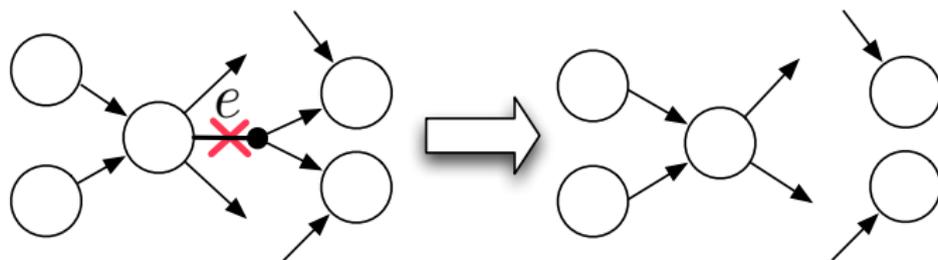
Source deletion

- $A' = A \setminus k$
- Source Y_k deleted, source k stops sending information to the network, $H(Y_k) = 0$
- Sinks requiring Y_k will no longer demand it.



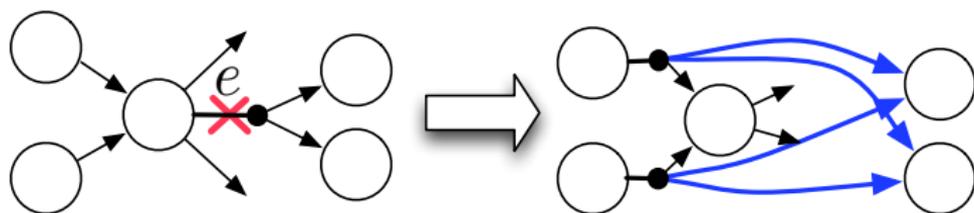
Edge deletion

- $A' = A \setminus e$
- Edge e deleted, nothing on U_e , $R_e = H(U_e) = 0$.



Edge contraction

- $A' = A/e$
- Edge e contracted, input to tail of e available for head of e , $R_e = \infty$, $H(U_e)$ free.

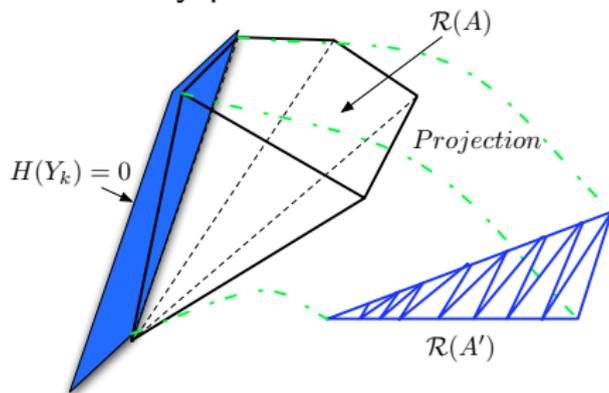


Source deletion: $A' = A \setminus k$

For each $i \in \{*, q, (s, q), o\}$,

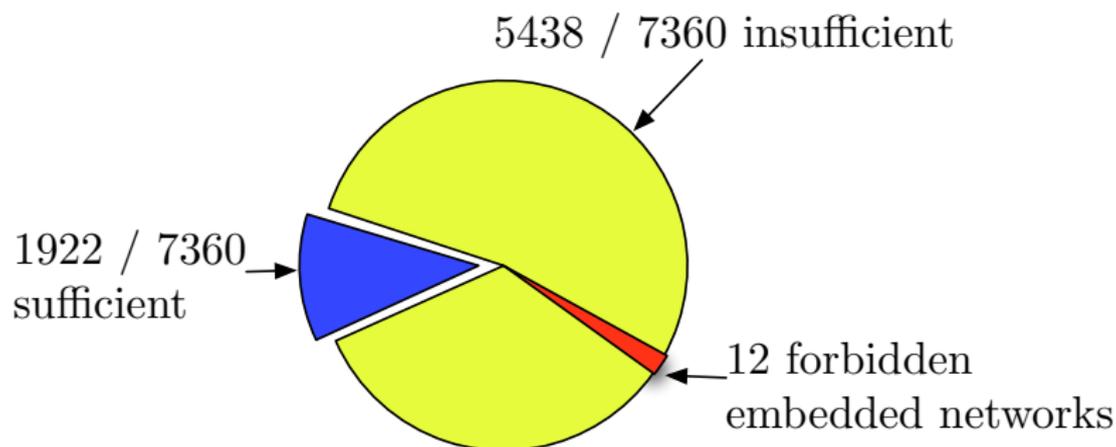
$$\mathcal{R}_i(A') = \text{Proj}_{\mathbf{Y}_{\setminus k}, \mathbf{R}_{\mathcal{E}'}} (\{\mathbf{R} \in \mathcal{R}_i(A) \mid H(Y_k) = 0\}) \quad (8)$$

Sufficiency preserved from large to small network as the equation shows.
Equivalently, insufficiency preserved from small to large network.



Example: Forbidden embedded networks

- Goal: minimal forbidden networks for sufficiency
- Scalar binary codes considered
- $k = 1, 2, 3$; $|\mathcal{E}| = 2, 3, 4$, 7360 non-isomorphic MDCS
- 1922 sufficient, 5438 insufficient
- 12 minimal forbidden minors (Li, *et. al* submission TransIT 2014)



Summary for embedding operators

- Three embedding operators: source deletion, edge deletion, edge contraction
- Rate region of smaller network derivable from the associated larger network
- Sufficiency of linear codes preserved from larger to smaller networks under embedding operations
- Equivalently, insufficiency of linear codes preserved from smaller networks to larger one

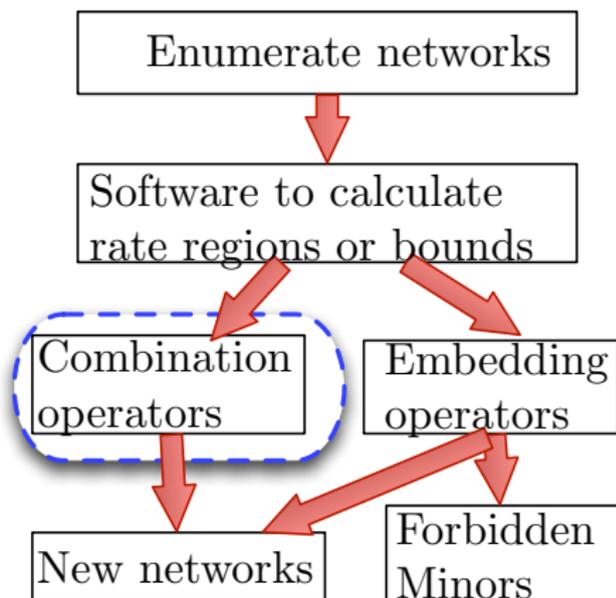
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2 Rate Region Computation

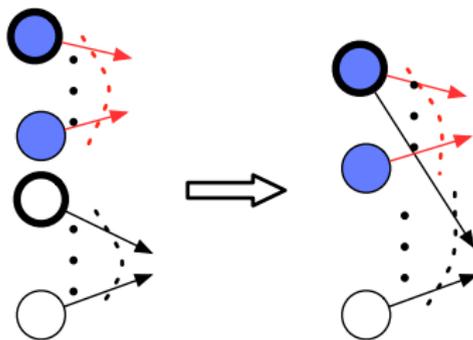
3 Network Operations

- Embedding Operations
- Combination Operations
- Play with both



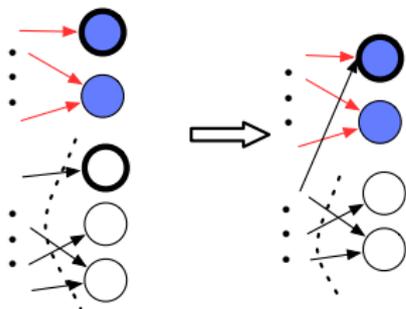
Source merge

- After merge: Merged sources serve as common sources to the two networks



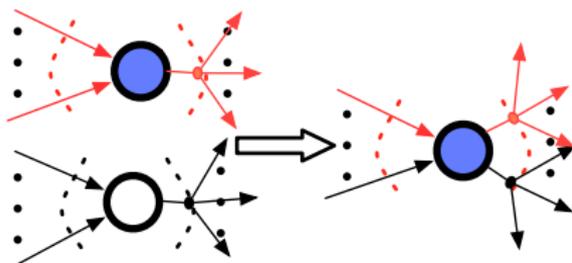
Sink merge

- After merge: Union the input and requests of sinks being merged, respectively



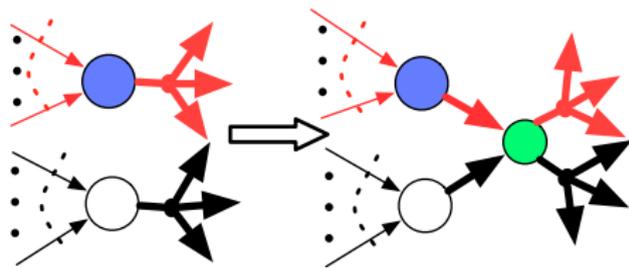
Intermediate node merge

- After merge: union input and output of the two nodes



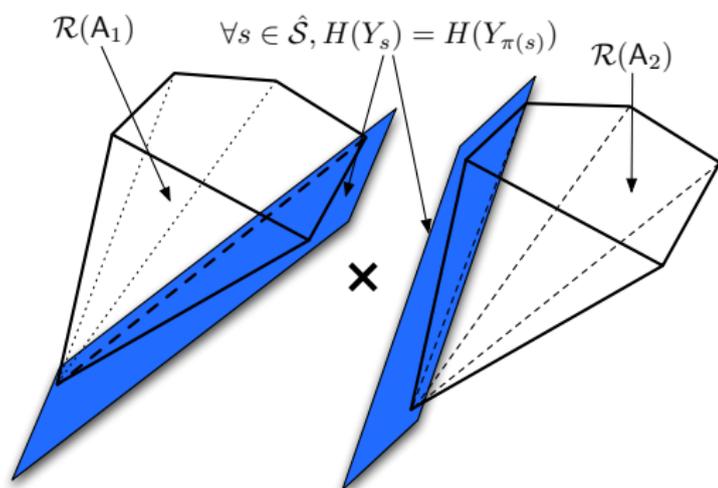
Edge merge

- Edge merge: create one extra node and four associated edges to replace the two original edges
- First two edges are ordinary edges connecting with the extra node, the other two edges connect the extra node with all the head nodes of the original two edges, respectively.
- Equivalent: create a relay node on the two edges, respectively, and then merge the two relay nodes.

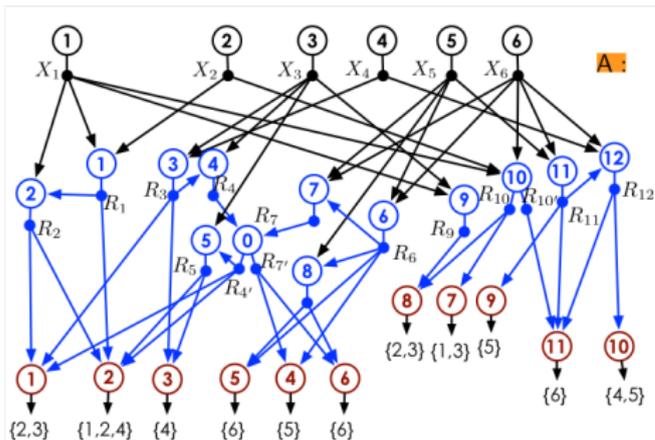


Source merge

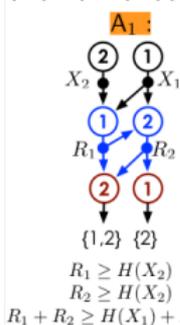
- A is obtained by merging A_1 . $\hat{S} = A_2.\pi(\hat{S})$, then for each $i \in \{*, q, (s, q), o\}$
- $\mathcal{R}_i(A) = \text{Proj}_{\setminus \pi(\hat{S})}((\mathcal{R}_i(A_1) \times \mathcal{R}_i(A_2)) \cap \mathcal{L}_0)$,
- $\mathcal{L}_0 = \{H(Y_s) = H(Y_{\pi(s)}), \forall s \in \hat{S}\}$
- Remark: essentially replace variables $Y_{\pi(s)}$ with the Y_s for each $s \in \hat{S}$.



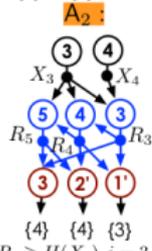
Obtain Rate Region for Larger Networks



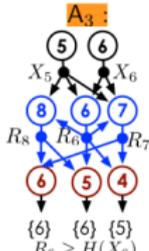
$$\begin{aligned}
 R_i &\geq H(X_2), i = 1, 2 \\
 R_1 + R_2 &\geq H(X_1) + H(X_2) \\
 R_i &\geq H(X_4), i = 3, 4, 4' \\
 R_3 + R_4 &\geq H(X_3) + H(X_4), i = 4, 4' \\
 R_3 + R_i + R_5 &\geq H(X_3) + 2H(X_4), i = 4, 4' \\
 R_6 &\geq H(X_6) \\
 R_i + R_8 &\geq H(X_6), i = 7, 7' \\
 R_6 + R_i &\geq H(X_5) + H(X_6), i = 7, 7' \\
 R_6 + R_i + 2R_8 &\geq H(X_5) + 2H(X_6), i = 7, 7' \\
 R_9 &\geq H(X_3) \\
 R_{10} &\geq \sum_{i=1}^3 H(X_i) \\
 R_{11} &\geq H(X_5) \\
 R_{12} &\geq H(X_4) + H(X_5) \\
 R_{10'} + R_{11} + R_{12} &\geq H(X_4) + 2H(X_5) + H(X_6)
 \end{aligned}$$



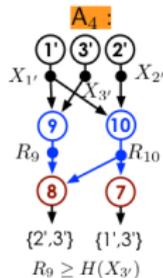
$$\begin{aligned}
 R_1 &\geq H(X_2) \\
 R_2 &\geq H(X_2) \\
 R_1 + R_2 &\geq H(X_1) + H(X_2)
 \end{aligned}$$



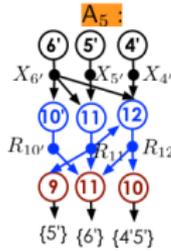
$$\begin{aligned}
 R_i &\geq H(X_4), i = 3, 4 \\
 R_3 + R_4 &\geq H(X_3) + H(X_4)
 \end{aligned}$$



$$\begin{aligned}
 R_6 + R_8 &\geq H(X_6) \\
 R_6 &\geq H(X_6) \\
 R_6 + R_7 &\geq H(X_5) + H(X_6) \\
 R_6 + R_7 + 2R_8 &\geq H(X_5) + 2H(X_6)
 \end{aligned}$$



$$\begin{aligned}
 R_9 &\geq H(X_{3'}) \\
 R_{10} &\geq H(X_{1'}) + H(X_{2'}) + H(X_{3'}) \\
 R_{10'} + R_{11} + R_{12} &\geq H(X_{4'}) + 2H(X_{5'}) + H(X_{6'})
 \end{aligned}$$



$$\begin{aligned}
 R_{11} &\geq H(X_{5'}) \\
 R_{12} &\geq H(X_{4'}) + H(X_{5'})
 \end{aligned}$$

Summary for combination operators

- Four combination operators: source, sink, node, and edge merge
- Rate region of combined network derivable from regions of smaller networks in the combination

Outline

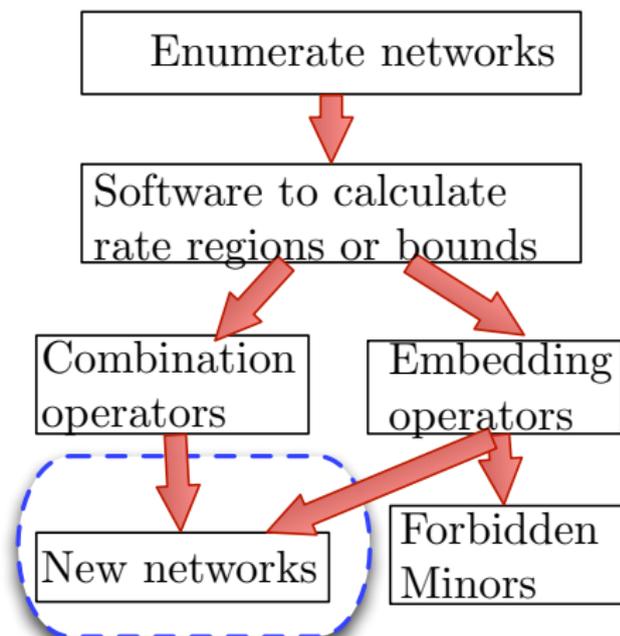
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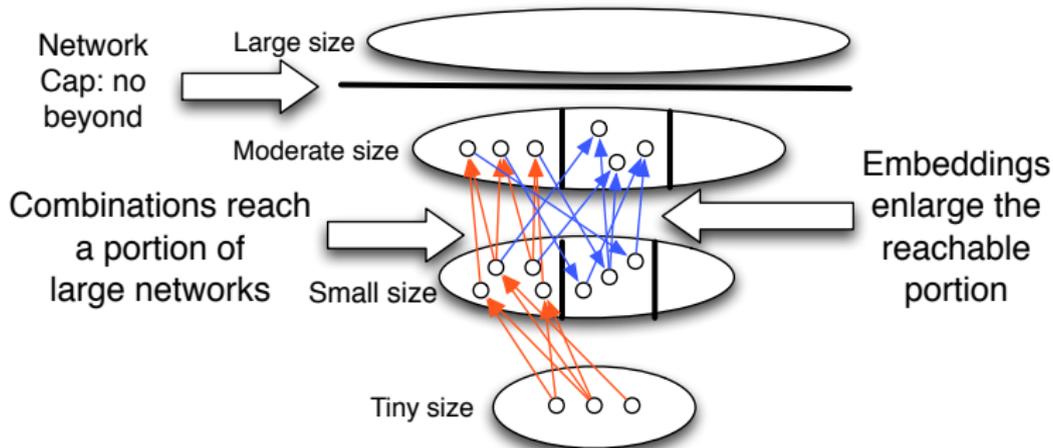
3 Network Operations

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- Combination Operations
- Play with both



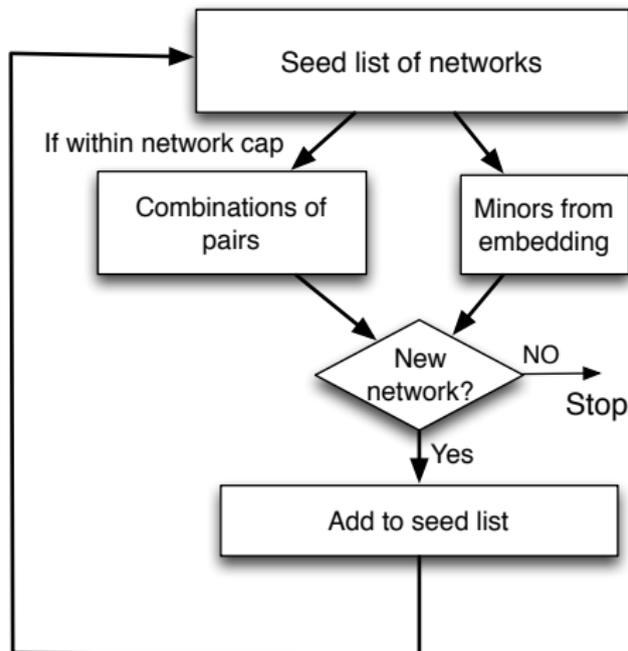
Combination operations suffice?

- Answer is NO.
- Need cap to limit the network size in the combinations.



Partial closure of networks

- Worst case partial closure of networks: cap the predicted size of networks involved in the process
- Let the pool produce new networks until no new network can be generated



New networks found from a tiny seed list

Start with the single (1, 1), single (2, 1), and the four (1, 2) networks;

size\cap	combination operators only			embedding and combinations		
	(3,3)	(3,4)	(4,4)	(3,3)	(3,4)	(4,4)
(1,3)	4	4	4	4	4	4
(1,4)	0	10	10	0	10	10
(2,2)	3	3	3	8	15	16
(2,3)	13	16	16	30	131	155
(2,4)	0	97	101	0	516	648
(3,2)	2	3	2	4	10	11
(3,3)	24	24	24	42	353	833
(3,4)	0	135	135	0	2361	5481
(4,2)	0	0	3	0	0	3
(4,3)	0	0	17	0	0	44
(4,4)	0	0	253	0	0	4430
all	46	292	568	88	3400	11635

New networks found from a tiny seed list

6 tiny networks can generate new 11635 networks with small cap!

size\cap	combination operators only			embedding and combinations		
	(3,3)	(3,4)	(4,4)	(3,3)	(3,4)	(4,4)
(1,3)	4	4	4	4	4	4
(1,4)	0	10	10	0	10	10
(2,2)	3	3	3	8	15	16
(2,3)	13	16	16	30	131	155
(2,4)	0	97	101	0	516	648
(3,2)	2	3	2	4	10	11
(3,3)	24	24	24	42	353	833
(3,4)	0	135	135	0	2361	5481
(4,2)	0	0	3	0	0	3
(4,3)	0	0	17	0	0	44
(4,4)	0	0	253	0	0	4430
all	46	292	568	88	3400	11635

New networks found from a tiny seed list

With the increase of cap size, number of new networks increases!

size\cap	combination operators only			embedding and combinations		
	(3,3)	(3,4)	(4,4)	(3,3)	(3,4)	(4,4)
(1,3)	4	4	4	4	4	4
(1,4)	0	10	10	0	10	10
(2,2)	3	3	3	8	15	16
(2,3)	13	16	16	30	131	155
(2,4)	0	97	101	0	516	648
(3,2)	2	3	2	4	10	11
(3,3)	24	24	24	42	353	833
(3,4)	0	135	135	0	2361	5481
(4,2)	0	0	3	0	0	3
(4,3)	0	0	17	0	0	44
(4,4)	0	0	253	0	0	4430
all	46	292	568	88	3400	11635

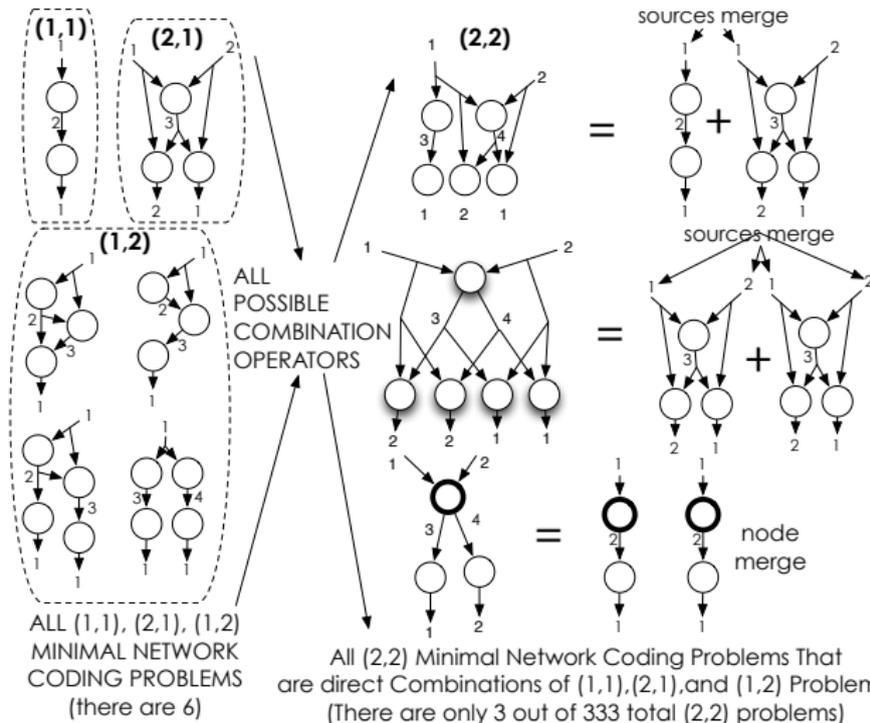
New networks found from a tiny seed list

Embedding operations are important in the process!

size\cap	combination operators only			embedding and combinations		
	(3,3)	(3,4)	(4,4)	(3,3)	(3,4)	(4,4)
(1,3)	4	4	4	4	4	4
(1,4)	0	10	10	0	10	10
(2,2)	3	3	3	8	15	16
(2,3)	13	16	16	30	131	155
(2,4)	0	97	101	0	516	648
(3,2)	2	3	2	4	10	11
(3,3)	24	24	24	42	353	833
(3,4)	0	135	135	0	2361	5481
(4,2)	0	0	3	0	0	3
(4,3)	0	0	17	0	0	44
(4,4)	0	0	253	0	0	4430
all	46	292	568	88	3400	11635

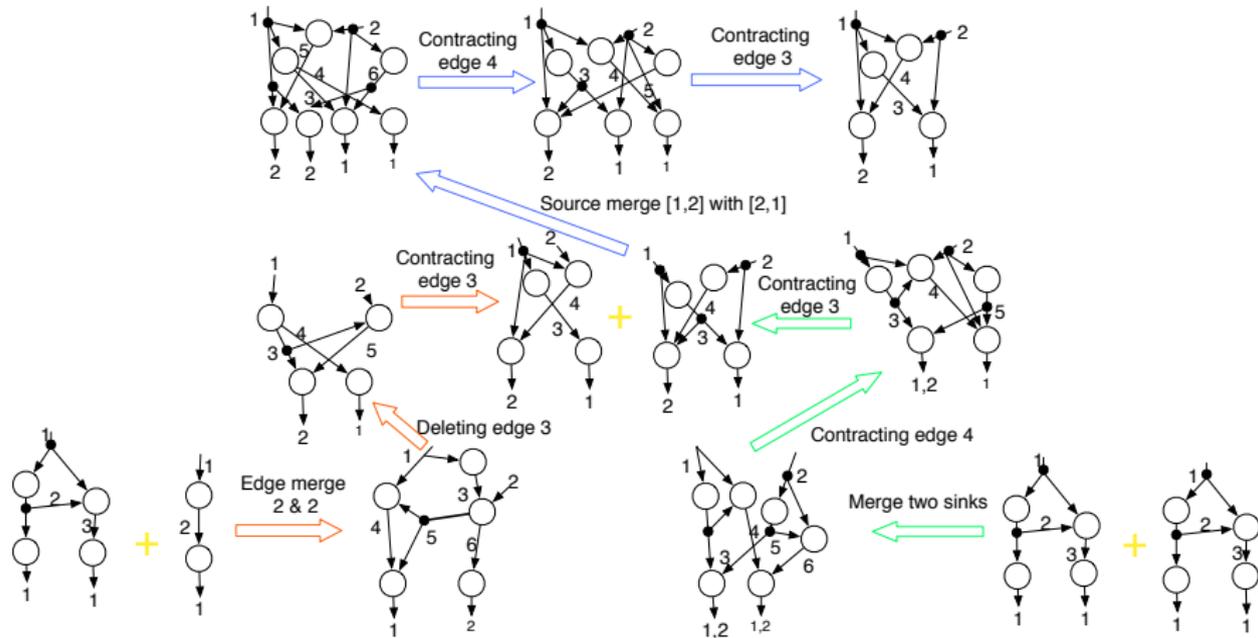
Example to see why integrating embedding is important

- Start with the single (1, 1), single (2, 1), and the four (1, 2) networks
- Only combination with cap (3, 4), get only 3 networks with size (2, 2)



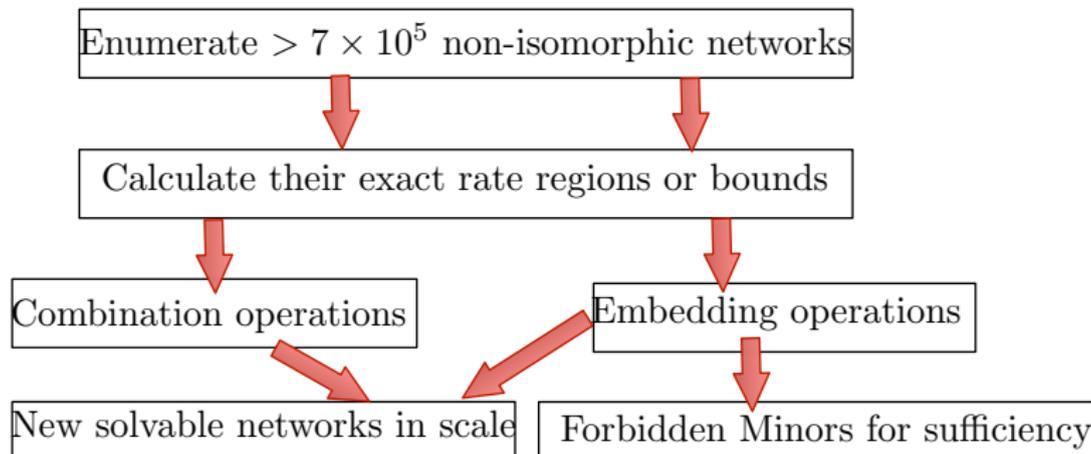
Example to see why integrating embedding is important

- Start with the single (1, 1), single (2, 1), and the four (1, 2) networks
- Consider both combination and embedding with same cap, found (2, 2) networks unreachable by combination only

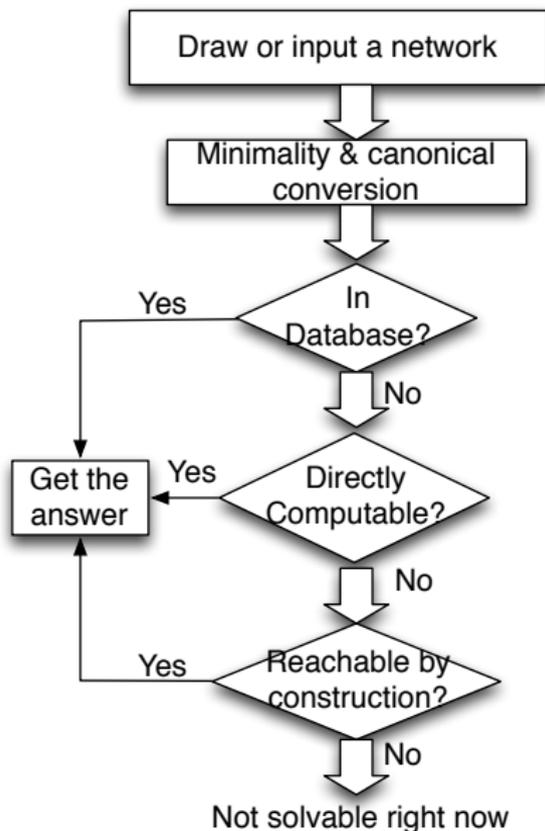


Summary of work thus far

Enumeration, Rate Region Computation, Forbidden Minors, New Networks



- Though we have online repository
- Want a user-friendly interface to easily get answer



- When Shannon outer bound is tight? Any common structure?
 - Is Shannon outer bound tight for all MDCS, or IDSC?
- Is the number of forbidden minors regarding the sufficiency of a class of linear codes finite?
- Coverage of the operators in all problems
- More operations: node & edge merge, source & sink merge
- A notion of forbidden minor which can harness both combination and embedding operators

Selected References



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Thank you!