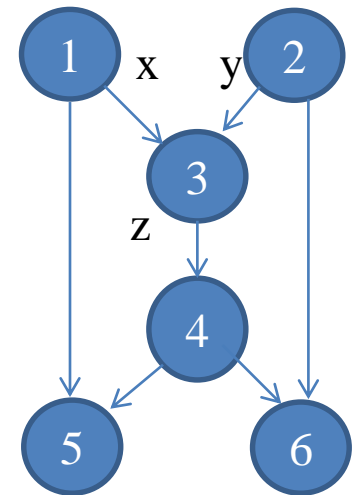


Multisource Multisink Network coding Capacities region found from the Region of entropic vectors.

Presented by :
Alexander Erick Trofimoff
PhD student
ECE department
Drexel University

Presentation Outline

1. Motivation : Acyclic **Multisource Multisink Network coding**
Region of capabilities: Max flow framework & Data Storage Scenario
2. Rate Region Implicit & exact Characterization
3. Polymatroid axioms & Matroids, Representable & entropic matroids, & Rate region Entropic Vectors Inner bounds
4. Entropic vectors enumeration: Analytical enumeration of binary linear codes
5. Algorithm to evaluate codes that achieve Network Rate region



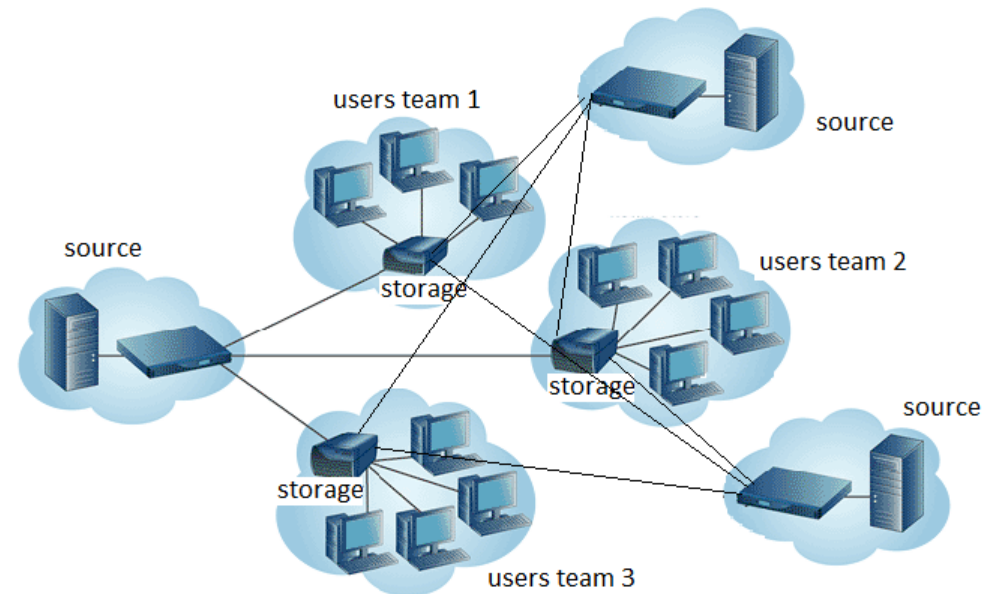
Motivation: Rate regions in Multisource Multisink Network Coding

Application Problems :

- ✓ Distributed Storage
- ✓ Max flow

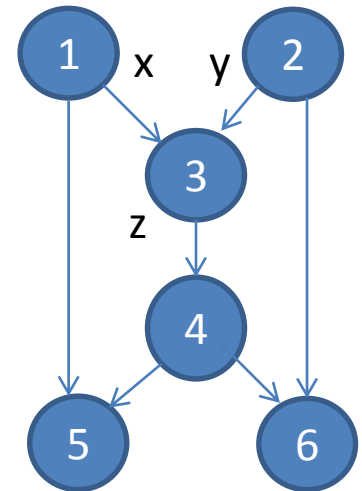
Aspects of interest :

- ✓ How much can be communicated ?:
Links capacities & encoding nodes.
- ✓ Variables of interest
original source rates & the capacities of the edges.
- ✓ Aspects to consider
The upper bounds of edge capacities,
over all possible ways of encoding messages on
intermediate nodes.

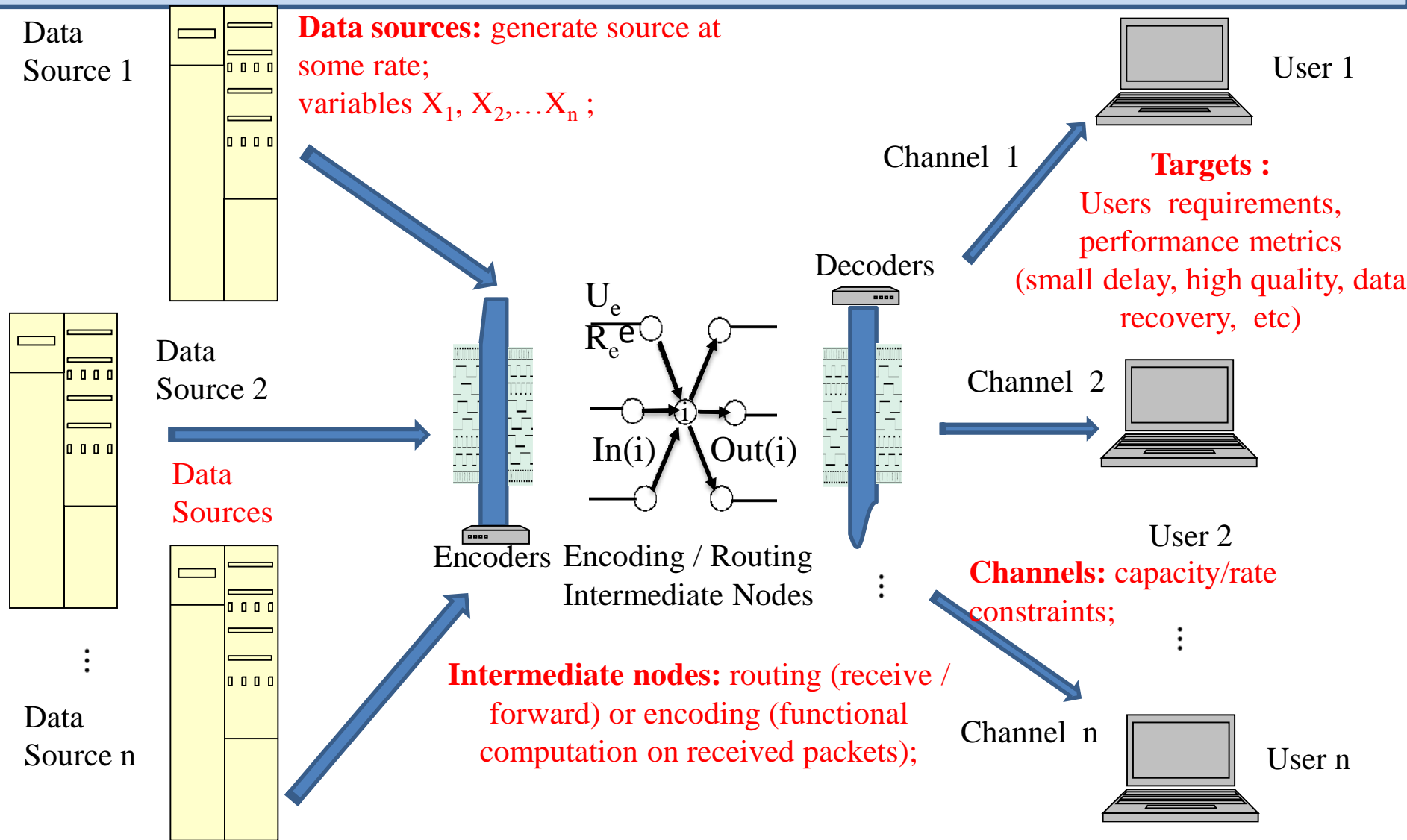


Presentation Outline

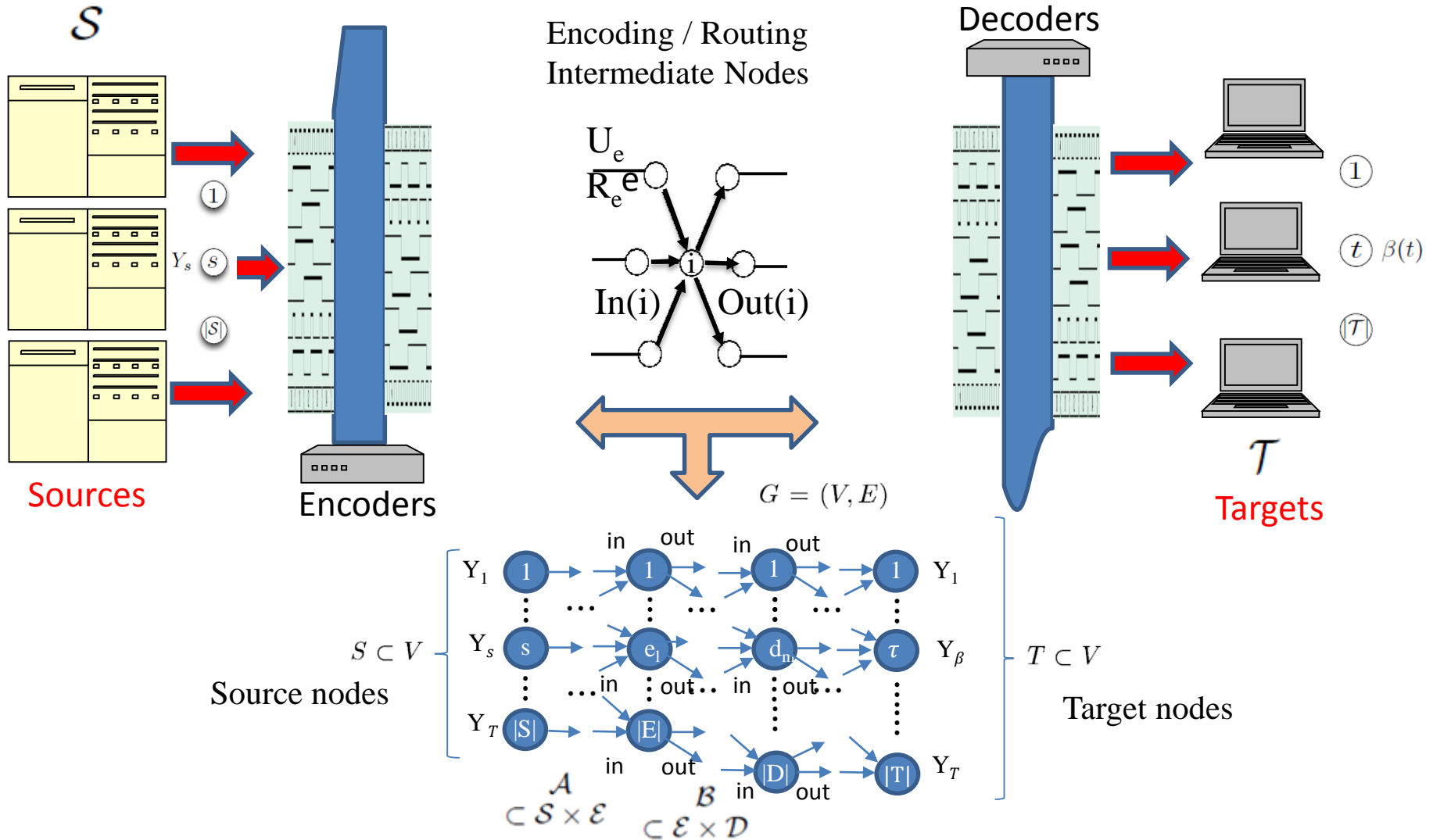
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1. General Acyclic Mutisource Multisink Network coding framework

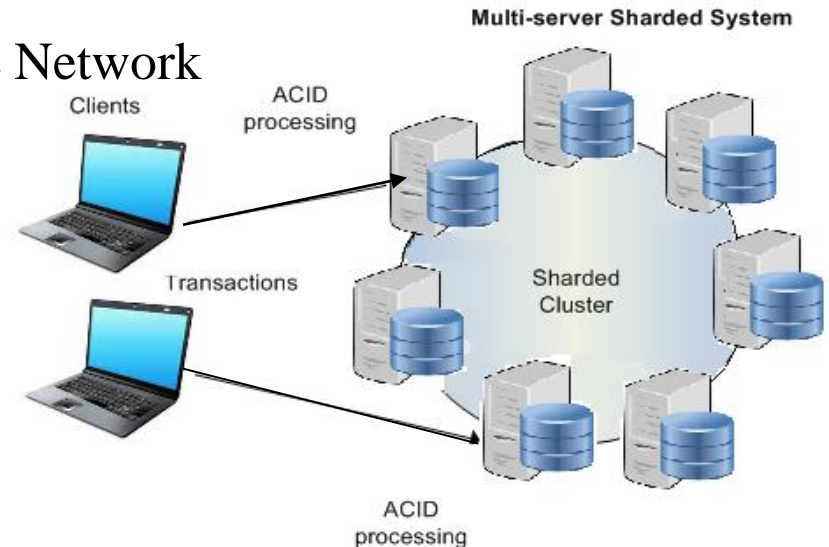


1. General Acyclic Mutisource Multisink Network coding framework



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The Region of capabilities in a distributed storage system

- ✓ **Parallel processing:** data distributed to speed computations.
- ✓ **Fault Tolerance:** Data distributed using secret sharing analysis techniques, originally developed to assure privacy.
- ✓ Using **Galois field and Network flow theories**, information can be stored at different sites with minimum of redundancy.
- ✓ This **prevents loss of data** if several sites become inaccessible.

Problem: Protection of multiple sites failures minimizing the storage used.

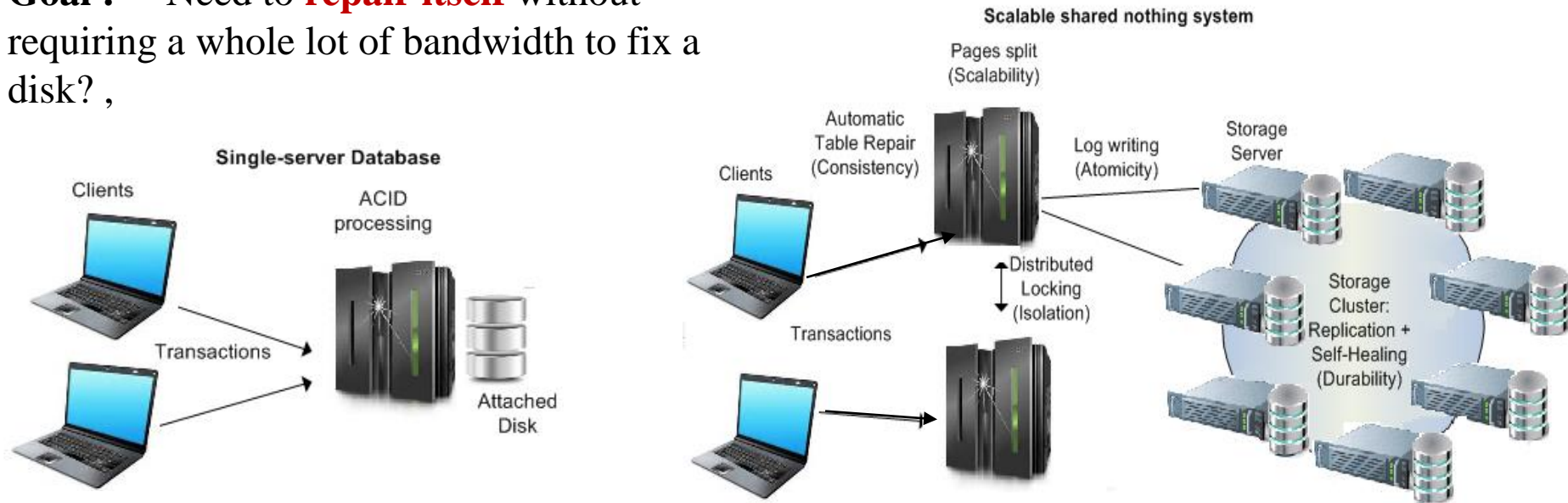
$$\begin{aligned}
 & \alpha_j \in GF(q^t) \quad V_j \in GF(2^{C_k}) \\
 & t = C_k \text{ (the number of bits per disk)}
 \end{aligned}
 \quad (V_1, \dots, V_k) = (U_1, \dots, U_k) \quad \overbrace{\begin{pmatrix} 1 & 1 & \dots & 1 \\ \alpha_1 & \alpha_2 & \dots & \alpha_k \\ \alpha_1^2 & \alpha_2^2 & \dots & \alpha_k^2 \\ \vdots & \vdots & & \vdots \\ \alpha_1^{k-1} & \alpha_2^{k-1} & \dots & \alpha_k^{k-1} \end{pmatrix}}^A \quad q = 2 \text{ (binary alphabet)}$$

The Region of capabilities in a distributed storage system

Problem : Distributed storage Backup systems to **restore information** from Disk failures.

Scenario: large **distributed storage system**, when disk failures,

Goal : Need to **repair itself** without requiring a whole lot of bandwidth to fix a disk? ,



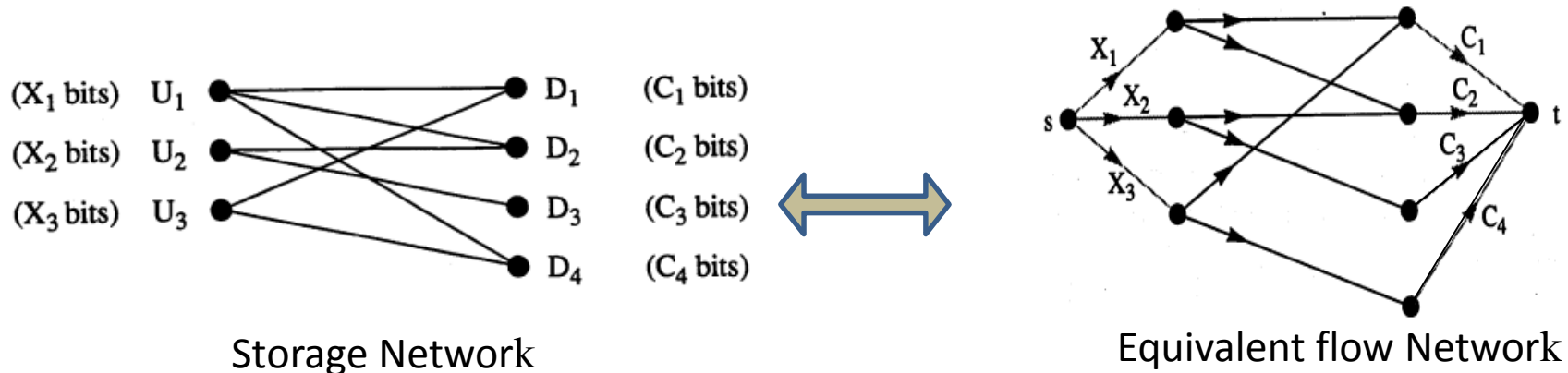
The Region of capabilities in a distributed storage system

Requirements : The disk when it is repaired be exactly **as it was before**.

Read the data from this way **without having to pull too much.**

Motivation:

The **fundamental limits** of this problem are **instances of network codes**.



$$C_1 \leq C_2 \leq \dots \leq C_n$$

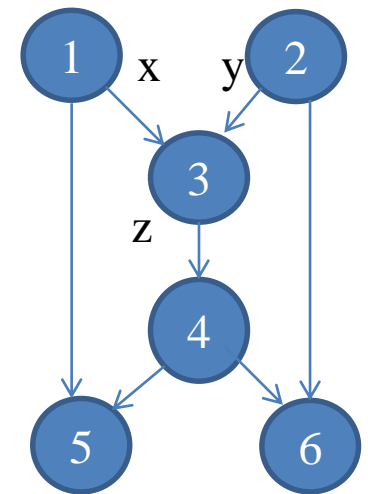
$$C_{\max} = C_1 + \dots + C_k.$$

$$V_j = U_1 + \alpha_j U_2 + \alpha_j^2 U_3 + \dots + \alpha_j^{k-1} U_k$$

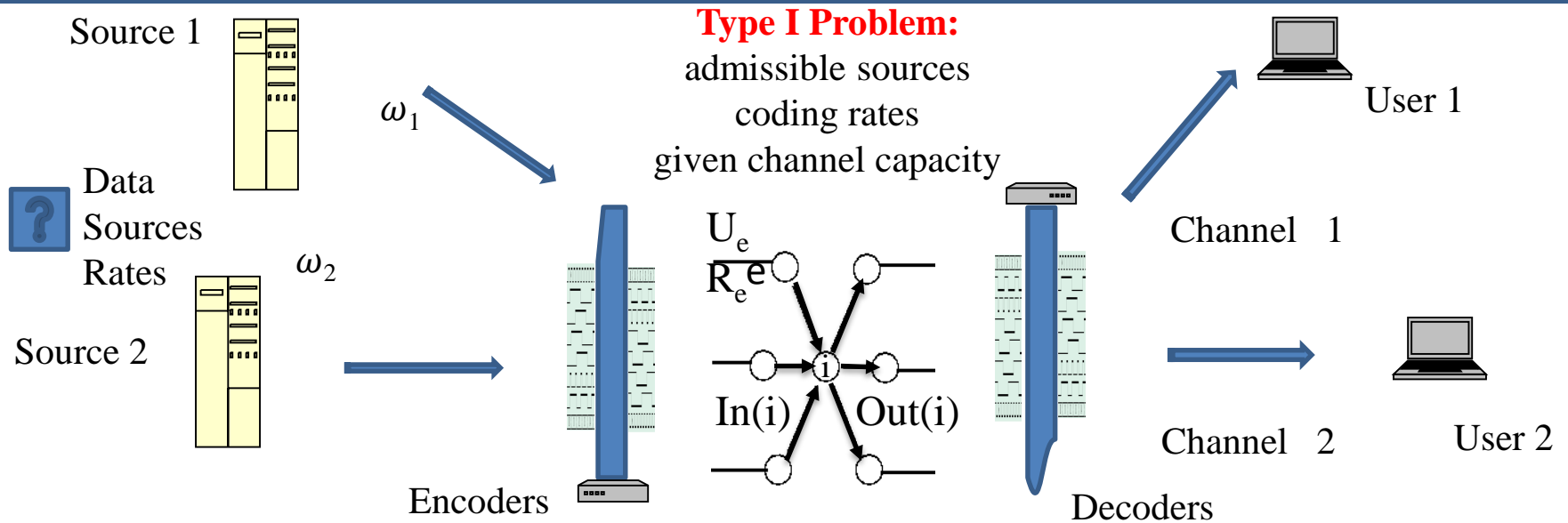
$$1 \leq j \leq k,$$

Presentation Outline

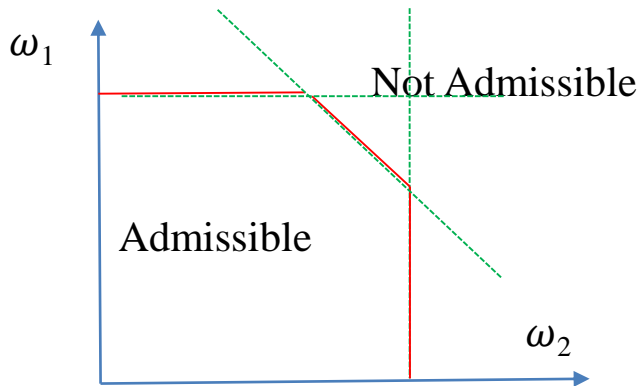
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The rate regions for Information flow on communication Wireless Network

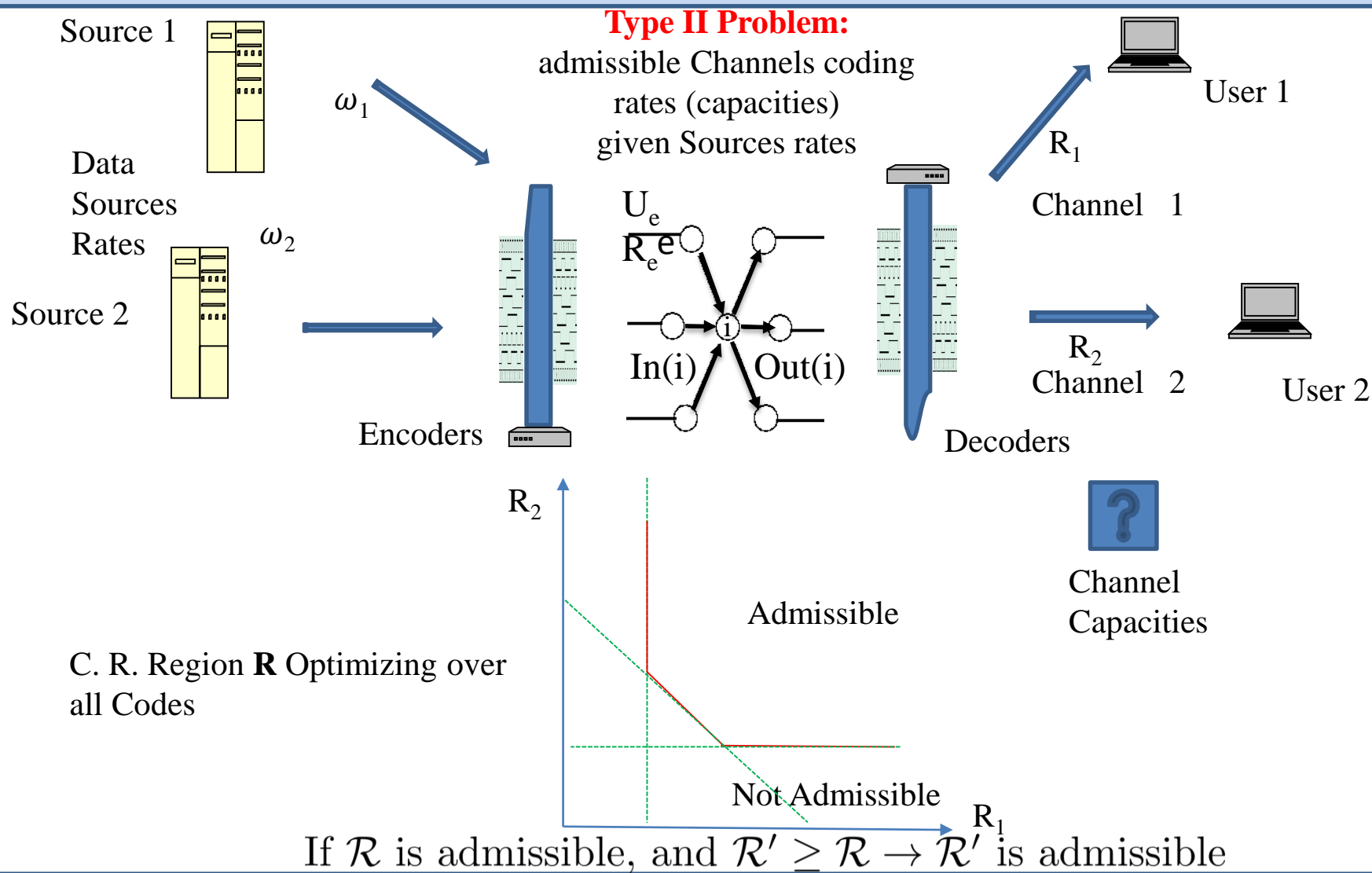


S. R. Region **W** Optimizing
over all Codes

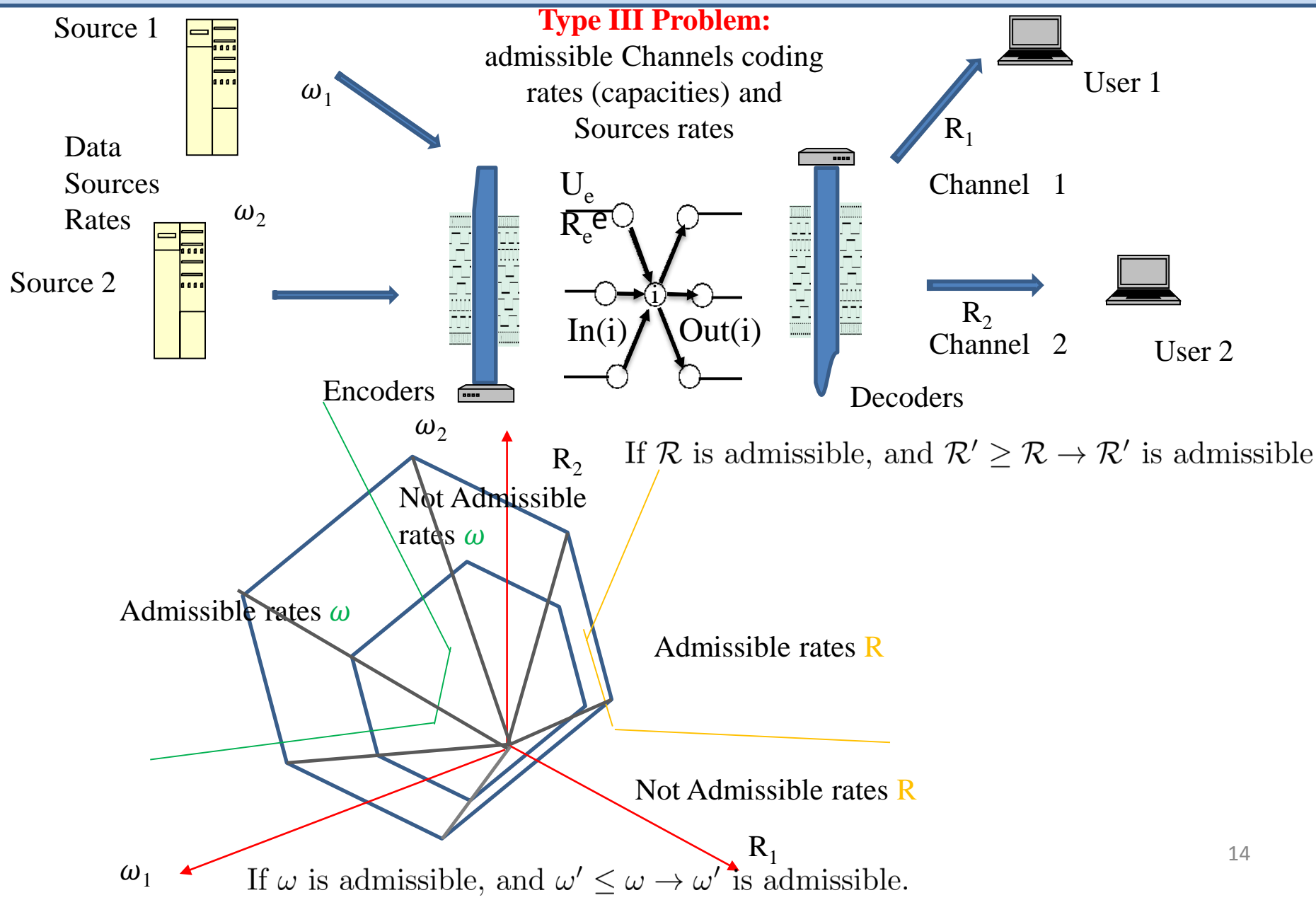


If ω is admissible, and $\omega' \leq \omega \rightarrow \omega'$ is admissible.

The rate regions for Information flow on Wireless Network Communication

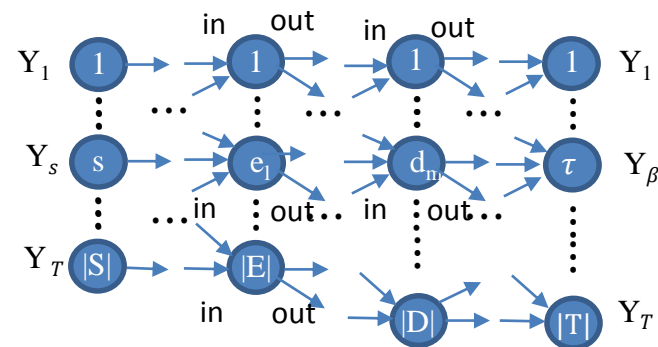


The rate regions for Information flow on Wireless Network Communication



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2. Rate Region Implicit Characterization by Yan & Yeung.

Shannon Information measures

Shannon Entropy

Measure of the **uncertainty** in a r.v.
Average **unpredictability** in a r.v.,
Information content

$$h_A = H(X_A) = - \sum_{X_A} p_{X_A}(X_A) \log p_{X_A}(X_A)$$

absolute limit on best possible
lossless encoding of any communication

Joint S. Entropy

$$h_{12} = H(X_1, X_2) = - \sum_{X_1 X_2} p_{X_1 X_2}(X_1, X_2) \log p_{X_1 X_2}(X_1, X_2)$$

Conditional S. Entropy

$$h_{2|1} = H(X_2|X_1) = - \sum_{X_1 X_2} p_{X_1 X_2}(X_1, X_2) \log p_{X_2|X_1}(X_2|X_1)$$

Mutual Information

$$I(X_1, X_2) = \sum_{X_1 X_2} p_{X_1 X_2}(X_1, X_2) \log \frac{p_{X_1 X_2}(X_1, X_2)}{p_{X_1}(X_1)p_{X_2}(X_2)}$$

Joint entropies are vectors.

$$h_A = H(X_A) = - \sum_{X_A} p_{X_A}(X_A) \log p_{X_A}(X_A)$$

$$\bar{h} = (h_A | A \subseteq \mathcal{N}) \in \mathbb{R}^{2^N - 1}$$

$$\mathcal{N} = 2 : \bar{h} = (h_1, h_2, h_{12})$$

$$\mathcal{N} = 3 : \bar{h} = (h_1, h_2, h_{12}, h_3, h_{13}, h_{23}, h_{123})$$

2. Rate Region Implicit Characterization by Yan, Yeung & Zhang.

Consider

$$Y_s, s \in S$$

$$U_e, e \in E$$

$$\mathcal{N} = \{Y_s; U_e\}$$

$$\mathcal{P}_{\mathcal{N}} = 2^{\mathcal{N}} \setminus \{\emptyset\}$$

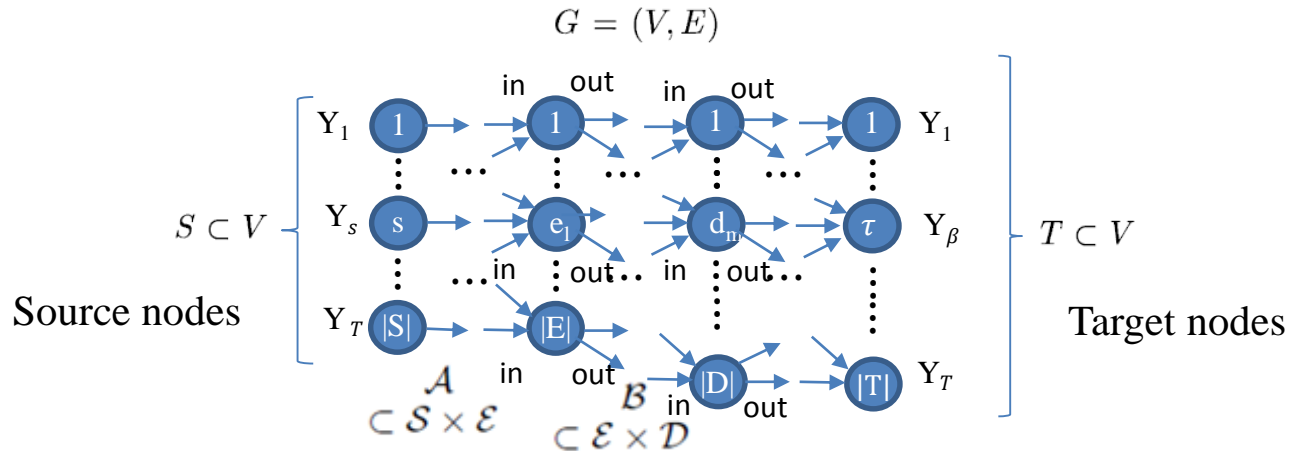
$$h = (h_A : A \in \mathcal{P}_{\mathcal{N}}\}$$

h is entropic if $h_A = H(X_A), A \in \mathcal{P}_{\mathcal{N}}$

$$\mathcal{H}_{\mathcal{N}} = \mathbb{R}^{2^{\mathcal{N}}-1}$$

$$\Gamma_{\mathcal{N}}^* = \{h \in \mathcal{H}_{\mathcal{N}} : h \text{ is entropic}\}$$

Entropic Region



Entropic Subregions

$$\mathcal{L}_0 = \{h \in \mathcal{H}_{\mathcal{N}} : h_{Y_s} \geq \omega_s, s \in S\}$$

$$\mathcal{L}_1 = \{h \in \mathcal{H}_{\mathcal{N}} : h_{Y_s} = \sum_{s \in S} h_{Y_s}\}$$

$$\mathcal{L}_2 = \{h \in \mathcal{H}_{\mathcal{N}} : h_{U_{Out(s)}|Y_s} = 0, s \in S\}$$

$$\mathcal{L}_3 = \{h \in \mathcal{H}_{\mathcal{N}} : h_{U_{Out(i)}|U_{In(i)}} = 0, i \in V \setminus (S \cup T)\}$$

$$\mathcal{L}_4 = \{h \in \mathcal{H}_{\mathcal{N}} : h_{U_e} \leq R_e, e \in E\}$$

$$\mathcal{L}_5 = \{h \in \mathcal{H}_{\mathcal{N}} : h_{Y_{\beta(t)}|U_{In(t)}} = 0, t \in T\}$$

C_1

C_2

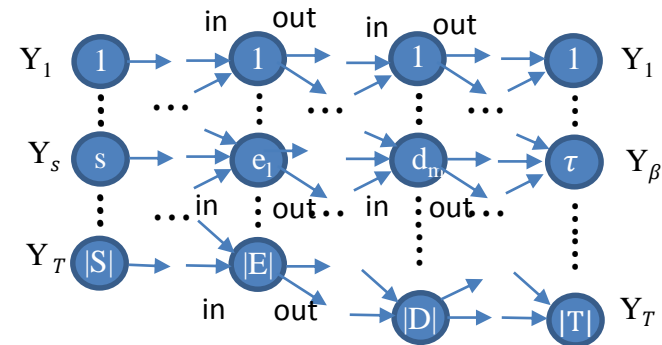
C_3

C_4

C_5

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2. Yan, Yeung & Zhang Exact Characterizing of Rate Region.

Some important conventions

For $\mathbf{h} \in \mathcal{H}_{\mathcal{N}} \longrightarrow \mathbf{h}_{Y_{\mathcal{S}}} = (h_{Y_s} : s \in \mathcal{S})$

For $\mathbf{h} \in \mathcal{H}_{\mathcal{N}} \longrightarrow \mathbf{h}_{U_{\mathcal{E}}} = (h_{U_e} : e \in \mathcal{E})$

For $\mathcal{B} \subset \mathcal{H}_{\mathcal{N}} \longrightarrow \text{proj}_{Y_{\mathcal{S}}}(\mathcal{B}) = \{\mathbf{h}_{Y_{\mathcal{S}}} : \mathbf{h} \in \mathcal{B}\}$

For $\mathcal{A} \subset \mathcal{H}_{\mathcal{N}} \longrightarrow \text{proj}_{U_{\mathcal{E}}}(\mathcal{A}) = \{\mathbf{h}_{U_{\mathcal{E}}} : \mathbf{h} \in \mathcal{A}\}$

If $\mathbf{h}' \in \mathcal{B} \rightarrow \Lambda(\mathcal{B}) = \{\mathbf{h} \in \mathcal{H}_{\mathcal{N}} : 0 \leq \mathbf{h} \leq \mathbf{h}'\}$

$\text{Ex}(\mathcal{B}) = \{\mathbf{h} \in \mathcal{H}_{\mathcal{N}} : \mathbf{h} \geq \mathbf{h}', \mathbf{h}' \in \mathcal{B}\}$

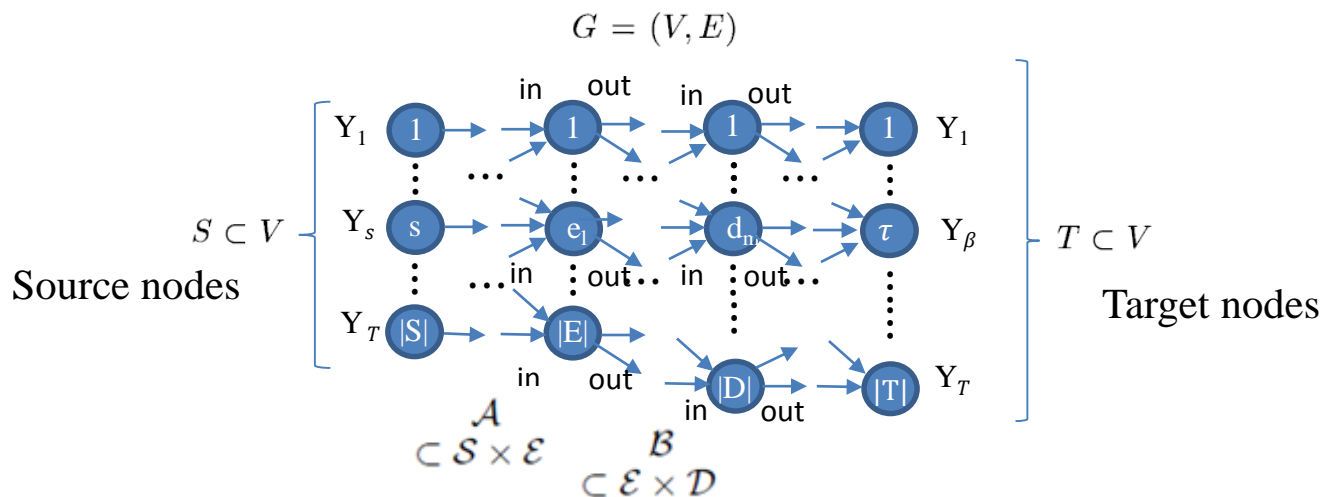
Let $\text{con}(\mathcal{B})$ be the convex hull of \mathcal{B} .

Let $\overline{\mathcal{B}}$ be the closure of \mathcal{B} .

$$\mathcal{W}' = \Lambda \left(\text{proj}_{Y_{\mathcal{S}}} \left(\overline{\text{con}(\Gamma_{\mathcal{N}}^* \cap \mathcal{L}_{123})} \cap \mathcal{L}_4 \cap \mathcal{L}_5 \right) \right)$$

$$\mathcal{R}' = \overline{\text{Ex} \left(\text{proj}_{U_{\mathcal{E}}} \left(\text{con}(\Gamma_{\mathcal{N}}^* \cap \mathcal{L}_{0123}) \right) \right)}$$

2. Yan, Yeung & Zhang Exact Characterizing of Rate Region.



Exact Rate Region expressions

$$\mathcal{W}' = \Lambda(\text{proj}_{Y_S}(\overline{\text{con}(\Gamma_{\mathcal{N}}^* \cap \mathcal{L}_{123})} \cap \mathcal{L}_4 \cap \mathcal{L}_5))$$

Theorem I

$$\mathcal{W} = \mathcal{W}'$$

Converse Theorem I

$$\mathcal{W} \subset \Lambda(\text{proj}_{Y_S}(\overline{\text{con}(\Gamma_{\mathcal{N}}^* \cap \mathcal{L}_{123})} \cap \mathcal{L}_4 \cap \mathcal{L}_5)) = \mathcal{W}'$$

$$\mathcal{R}' = \mathcal{R} \subset \mathcal{R}' = \overline{\text{Ex}(\text{proj}_{U_E}(\text{con}(\Gamma_{\mathcal{N}}^* \cap \mathcal{L}_{0123}))})}$$

Theorem I



$$\mathcal{R} = \mathcal{R}'$$

Converse Theorem I

$$\mathcal{R} \subset \mathcal{R}' = \overline{\text{Ex}(\text{proj}_{U_E}(\text{con}(\Gamma_{\mathcal{N}}^* \cap \mathcal{L}_{0123}))})}$$

Calculation of rate regions which are projections of the entropic vectors region .

Information Th.

Solving Maxflow or
Distributed Storage Systems

For any liner objective we require
to determine the Rate region.

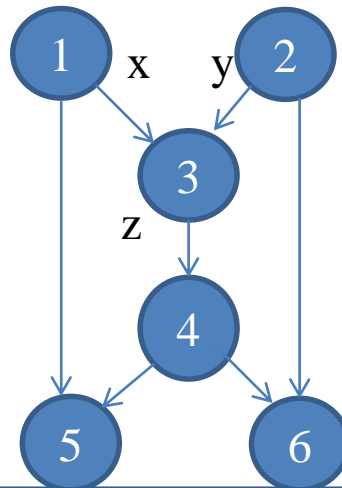
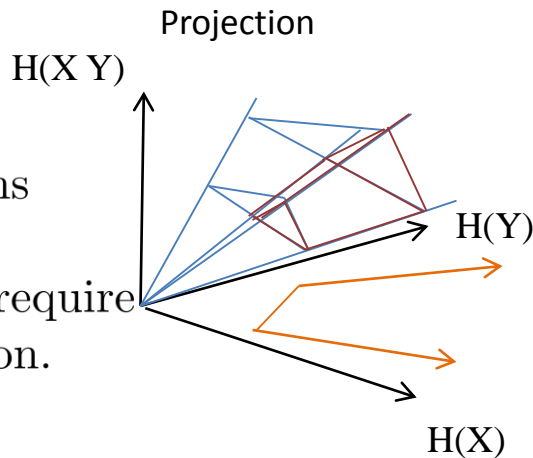
Binary Matroids Entropic
region Inner bound

⇓

Characterize Rate region
in terms of Entropic Region s.t.

⇓

Binary linear codes suffice with
 \oplus as the most complex operation



Network Codes Solutions

Codes Achieving Inf. Rate Region
at extreme points

Network Topology

⇓

Sources Indep.Constr.

Encoder Constr. on S.Var. & Aux.Var.

Decoder Constr. on Aux.Var & Rec.Var.

Add rate inequalities

Project over variables of interest s.t.

⇓

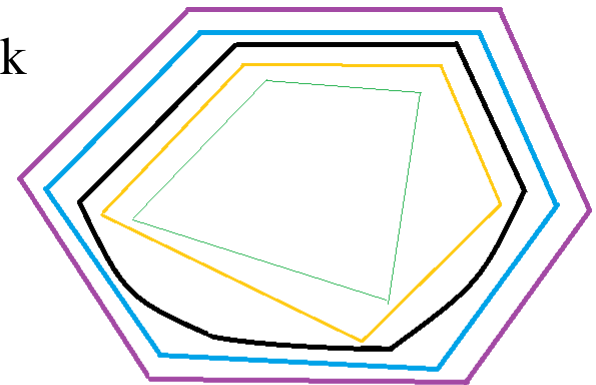
Efficiently use of Channels

for higher throughput

Minimum efficient Backup Support
for Distributed Storage system

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$N \geq 4$

— (green)	Inner bounds
— (yellow)	Entropic Vectors
— (black)	
— (blue)	
— (purple)	Outer bounds

3. The Polymatroid Axioms

Given a r.v. X_n , finite Alphabet,

$$h : \alpha \subseteq \{1, 2, \dots, n\} = \mathcal{N} \rightarrow \mathbb{R}^+$$

$$\text{Each } X_\alpha \rightarrow h(X_\alpha) \in \mathbb{R}^{\mathcal{P}(\mathcal{N})}$$

$\forall h$ we have:

1. $h(\emptyset) = 0$
2. $h(i) \leq h(j) \quad \forall i \subseteq j \subseteq \mathcal{N}$
3. $h(i) + h(j) \geq h(i \cup j) + h(i \cap j) \quad \forall i, j \subseteq \mathcal{N}$

$$\Gamma_N = \{h | h : 2^E \rightarrow Z^+\}$$

4. Entropic Region, its Closure and Polymatroid functions region.

The Entropic Region & its Closure

$$\overline{\Gamma}_2^* = \Gamma_2 \text{ Polyhedral C.}$$

$$\overline{\Gamma}_3^* = \Gamma_3 \text{ Polyhedral C.}$$

$$\overline{\Gamma}_4^* \neq \Gamma_4 \text{ Convex C.}$$

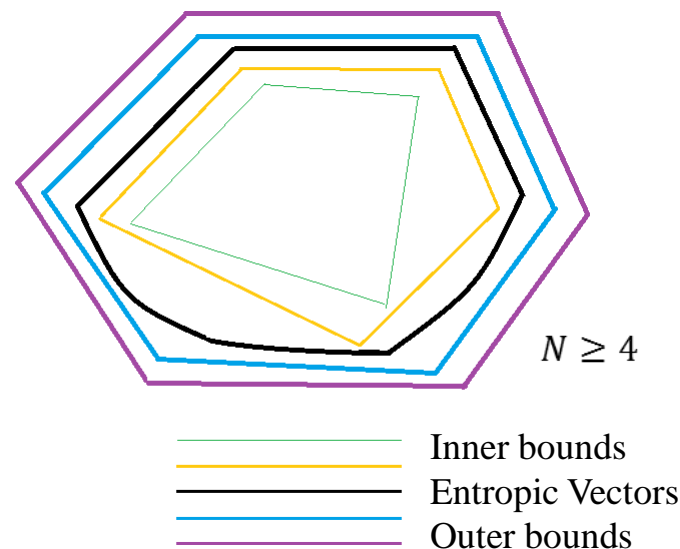
$$\overline{\Gamma}_N^* \neq \Gamma_N \text{ Unknown.}$$

$$\overline{\Gamma}_2^* = \Gamma_2 \text{ Th. Z. Zhang \& R. Yeung 1997}$$

$$\overline{\Gamma}_3^* = \Gamma_3 \text{ Th. Z. Zhang \& R. Yeung 1997}$$

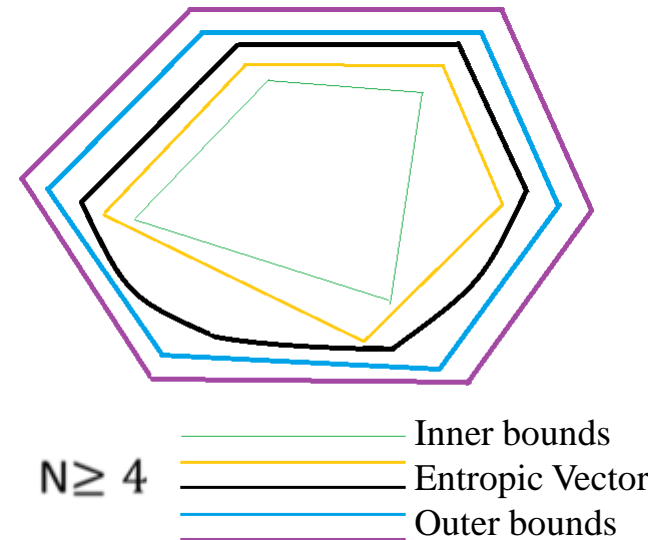
$$\overline{\Gamma}_4^* \neq \Gamma_4 \text{ Th. Z. Zhang \& R. Yeung 1998}$$

$$\text{For } N \geq 4, \overline{\Gamma}_N^* \neq \Gamma_N \text{ Th. Z. Zhang \& R. Yeung 1998}$$



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3. Shannon Entropy, Joint Entropies and Shannon Inequalities

Entropic Region, its Closure and Properties.

Entropy vector of N variables:
Shannon entropy of all possible
subset of N variables

Case $N < 4$

Completely determined for $N < 4$,
(Polyhedral cone)

Not known for $N \geq 4$,
non-polyhedra cone,
outer bound and inner bound

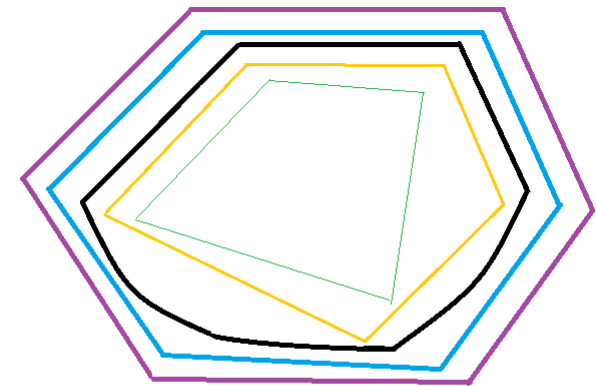
Region of Entropic Vectors

Case $N \geq 4$

Origin is entropic

If a vector \mathbf{h} is entropic,
 $\alpha \mathbf{h}, \alpha \geq 0$ is also entropic.
Hence, the region is a cone.

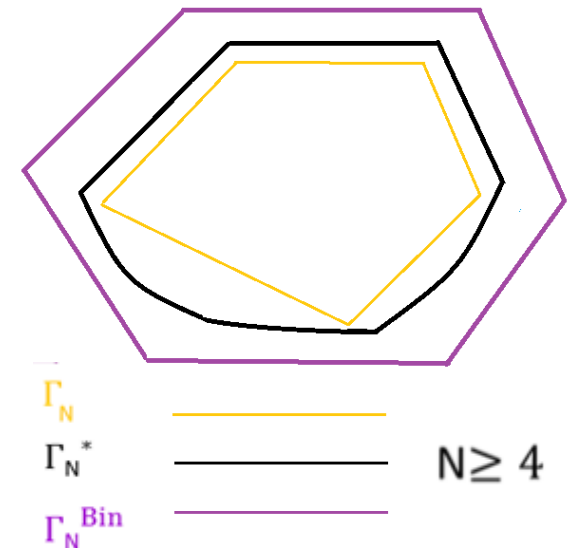
For $N < 4$, the region (or
closure) is a polyhedral convex
cone.



Inner bounds
Entropic Vectors
Outer bounds

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4. Matroid Axioms

(E, r) be a matroid $\rightarrow E$ finite set, function $r : 2^E \rightarrow Z^+$

r obey Polymatroid Axioms, $\forall \alpha, \beta \subset E$

A green rectangular box with a blue border contains three lines of text representing the Polymatroid Axioms:

$$\begin{aligned} r(\emptyset) &= 0 \\ \alpha \subseteq \beta &\rightarrow r(\alpha) \leq r(\beta) \\ r(\alpha \cup \beta) + r(\alpha \cap \beta) &\leq r(\alpha) + r(\beta) \end{aligned}$$

A large green arrow points from the right side of this box to the set definition $\Gamma_N = \{r \mid r : 2^E \rightarrow Z^+\}$.

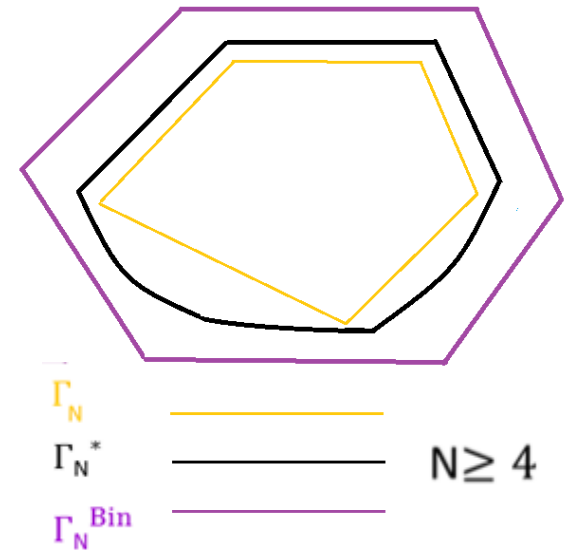
Integer valued Polymatroids r , s.t. $r(\mathcal{A}) \leq |\mathcal{A}|$ are matroids,
 $\mathcal{A} \subset E$

Linear representable Matroids are all matroids r s.t.

$$r(\mathcal{A}) \propto |v|, v \subseteq R^n \text{ for some } n \in Z^+$$

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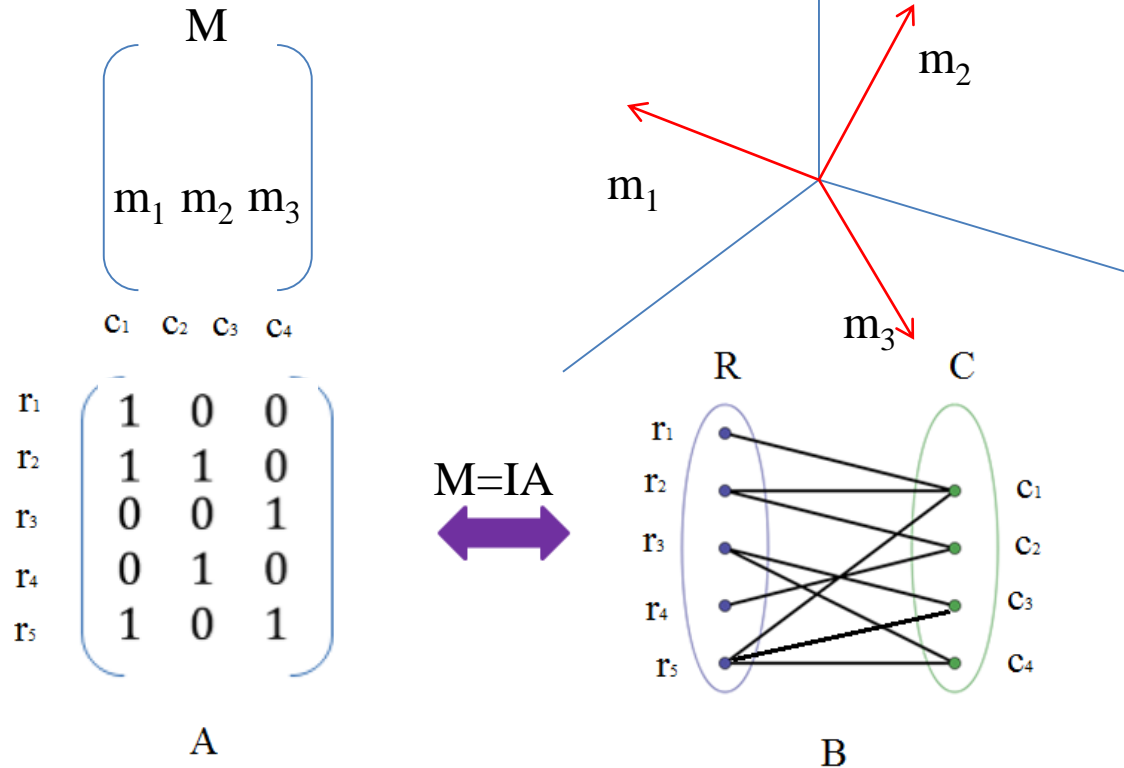
4. Representable Matroids and Entropic Matroids.

Representable Matroids

M is representable if (E, r) can be rep. by $V \in F^r$

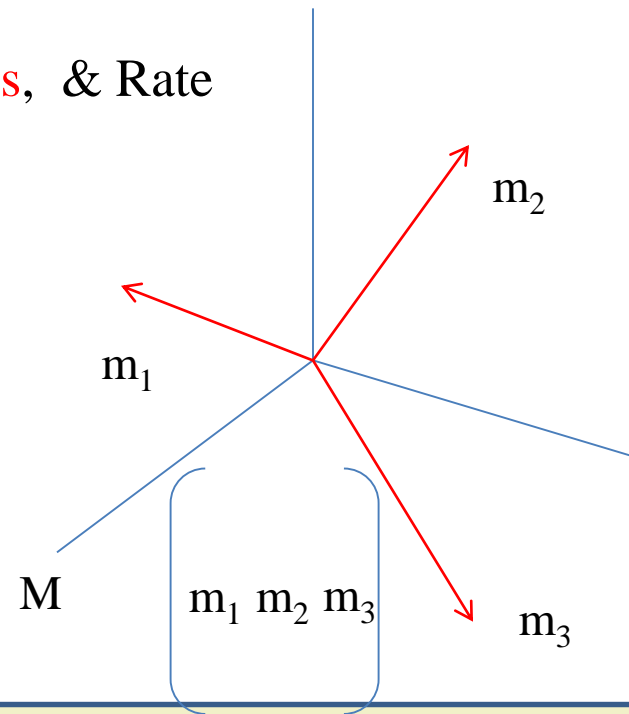
$\exists V \in F^r$ and $f : E \rightarrow V$ s.t. $r(V) \geq \dim f(X) \forall X \subseteq E$

if $|E| = N, \exists A \in F^{r \times N}$ s.t. $r(X) + r(Y) \geq r(X \cap Y) + r(X \cup Y) \forall X, Y \in \text{Col}(A)$



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4. Representable Matroids and Entropic Matroids.

Representable Matroids & Entropic Matroids

Not all Entropic Matroid \Rightarrow Rep. Matroid,

but All Rep. Matroid \Rightarrow Entropic Matroid.

If $h \in \Gamma^*$ is rep. \Rightarrow Assoc. Network Prob. has Optimal sol.
 \therefore, \exists linear Network code over F that achieve rate region.

4. Representable Matroids and Entropic Matroids.

All Representable Matroids are Entropic Matroids

Given (E, r) Matroid, $|E| = N$, $r(E) = k$ rep. over F_q , $|F| = q$,
rep. by $A \in F_q^{k \times N}$ s.t. $\forall B \subseteq E$, $r(B) = \text{rank}(A_{:,B})$.

Conic hull, Γ_N^q are all Matroid rank functions with
 N elements, rep. in F_q .

$\Gamma_N^q \subseteq \overline{\Gamma_N^*}$, since any extremal $r \in \Gamma_N^q$ is rep.
assoc. to $A \in F_q^{k \times N}$,

Def. r.v. $(X_1, \dots, X_N) = uA$, $u \sim U(F_q^k)$, $X_n = \sum_i^k u_i a_{in}$,
 $h_B = r(B) \log_2 q$, $\forall B \subseteq E$; $r(B) = \text{rank}(A_{:,B})$, all extremal rays of
 Γ_N^q are entropic, $\Gamma_N^q \subseteq \overline{\Gamma_N^*}$

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$$b(n, \leq r) = \frac{\sum_{(A, \pi) \in GL_r^2 \times S_n} |Z_{A, \pi}|}{|GL^2| |S_n|}$$

5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

A new technique to find Best tied Inner bound for the Region of entropic vectors

For every representable matroid there is an entropic vector.

we want to list isomorphic classes of representable matroids .

how many are needed to list?

we can enumerate them without generating all of them,

(Marcel Wild 1993,) .

An efficient procedure is required, since **the number usually is extremely large.**

Abstract algebra approach can **actually list all of them** (A.Kerber, H.Friepertinger, Laue , Bayreuth University, Germany 1994)

5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

✓ binary linear codes- Abstract Algebra Perspective – Dr. Marcel Wild research.

1st step: From
counting of orbits
to **averaging**
fix points.

- ✓ Groups
- ✓ Cauchy-Frobenius Counting Lemma
- ✓ Orbits enumeration – fix points Average.
- ✓ Groups for binary linear matroid isomorphic classes enumeration .

$$b(n, \leq r) = \frac{\sum_{(A, \pi) \in GL_r^2 \times S_n} |Z_{A, \pi}|}{|GL^2| |S_n|}$$

Cauchy-Frobenius Burnside Counting theorem

Lemma: The orbit-counting theorem, result in group theory useful in taking account of symmetry when counting mathematical objects.

⌊ G be finite group acts on a set X . For each $g \in G$,

⌊ X_g be set $x \in X$ that are fixed by g .

It states that $|G \backslash X| = \frac{1}{|G|} \sum_{g \in G} |X_g|$

\therefore number of orbits ($\in \mathbb{N}$ or $+\infty$) = \bar{x} of points fixed by $g \in G$.

5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

Defining groups involved in the **enumeration of the isomorphic classes of binary r rank matroids on n elements**

To find $b(n, r)$,
consider the group $GL_r^2 \times S_n$,

GL_r^2 general linear group
 S_n is the symmetric group on $1, 2, \dots, n$.

The group acts on the set of matrices $M := (a_1, a_2, \dots, a_n) \in GF(2)^{r \times n}$

$$(A, \pi) * (a_1, \dots, a_n) := (Aa_{\pi^{-1}1}, \dots, Aa_{\pi^{-1}n})$$

Non singular matrix

General Linear Group

elementary row Operations (change of basis)

Permutation group that change the order
of the columns , moving columns with their
Respective labels.

Double Group Action

5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

Number of orbits equals the average of fix points

The orbits $G(x) \Leftrightarrow$ isomorphism classes of binary matroids of n elements with
rank $\leq r$

$$\lrcorner Z(A, \pi) := \{M \in Z : (A, \pi) * M = M\}$$

Main Result of Wild: Using Burnside lemma , number of orbits is

$$b(n, \leq r) = \frac{\sum_{(A, \pi) \in GL_r^2 \times S_n} |Z_{A, \pi}|}{|GL^2| |S_n|}$$

number of orbits = average of fix points.

$$\text{Also } b(n, r) = b(n, \leq r) - b(n, \leq r - 1)$$



5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

To evaluate $\sum_{(A,\pi) \in GL_r^2 \times S_n} |Z_{A,\pi}|$ is difficult, since the so large number of summands.

Hence, equivalently,

$$b(n, \leq r) = \frac{\sum_{(A,\pi) \in GL_r^2 \times S_n} \prod_{i=1}^n |Y_{A^i}|^{a_i(\pi)}}{|GL^2| |S_n|}$$

Instead of matrices $M \in GF(2)^{r \times n}$, consider mappings $f : 1, 2, \dots, n \rightarrow GF(2)^r$.

A, π act on $X := 1, 2, \dots, n$ and $Y := GF(2)^r$, through maps f ,
 $Y^X := \{f | f : X \rightarrow Y\}$ by

$$(A, \pi) * f := A \circ f \circ \pi^{-1}$$

Y_{A^i} : points fixed by $A^i \in GL_r^2$, s.t. $A^i.M = 1.M = M$

$a_i(\pi)$: | cycles of length i | in the cycle decomposition of π ($1 \leq i \leq n$)

5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

- ✓ Analytical approach for binary linear codes- Abstract Algebra – from Dr. Marcel Wild research.

2nd step:

Averaging

Sym group fix points from points fixed by a canonical representative of Conjugacy classes
Times size of the class.

- ✓ Computing fix points through conjugacy classes.
- ✓ Burnside Lemma expression in terms of Conjugation

$$b(n, \leq r) = \frac{\sum_{(A, \pi) \in nGL_r^2 \times S_n} \prod_{i=1}^n |Y_{A^i}|^{a_i(\pi)}}{|GL^2| |S_n|}$$

5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

Averaging

Matrices fixed in Y by elementary row operations under the action of **exponential linear group** H^x

and

Matrices fixed on column labels permutations on X under the action of **symmetric subgroup** G

through

Product of

fix points induced by **canonical representatives** of equivalence classes of

Conjugation of the two groups

Times

Cardinalities of the Sets of all such Conjugacy **equivalence classes** of groups G and H^x

Conjugacy classes of Matrices

$\perp D$ is conjugacy class $\in GL_r^2$.
 $D^i = \{A^i | A \in D\}$ is also a conjugacy class.

$D_1, D_2, \dots, D_{k(r)}$, conjugacy classes of GL_r^2
enumerated in arbitrary order.

$\forall 1 \leq \mu \leq k(r)$ and $\forall 1 \leq i \leq n$,
 D_μ , is a similar class of invertible matrices
 $fix(\mu, i)$ be common number of fixpoints $\forall A^i \in D_\mu^i$,
the number of eigenvectors (including zero)
 $\forall A \in D_\mu$.

5. Entropic vectors enumeration: Analytical enumeration of binary linear codes

Summarizing these concepts,
the orbits counting expression found from Burnside Lemma
we get:

Sym classes Cardinality group conjugacy

GL₂ group conjugacy classes Cardinality

Type of permutation is associated with a Sym group Conjugacy class, parametrized by λ .

$$b(n, \leq r) = \frac{\sum_{\lambda \in Part(n)} \sum_{1 \leq \mu \leq k(r)} |C_\lambda| |D_\mu| \prod_{i=1}^n fix(\mu, i)^{a_i(\lambda)}}{|GL_r^2| |S_n|}$$

Points fixed by representative of GL₂ group Conjugacy Class parametrized by μ

λ parametrize the conjugacy classes C_λ of the group S_n .

To Average points fixed under the double group Action

It suffices to count

the fix points of just only one representative of

Their conjugacy classes

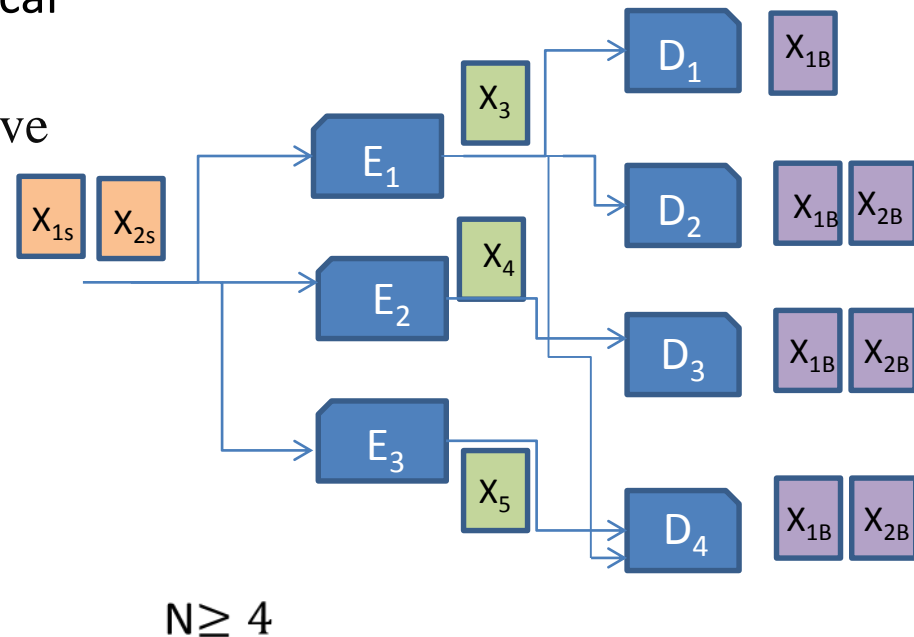
and multiply the result by

the cardinality of sets of conjugacy classes.

Considering Conjugacy classes and number of points fixed by representatives of them.

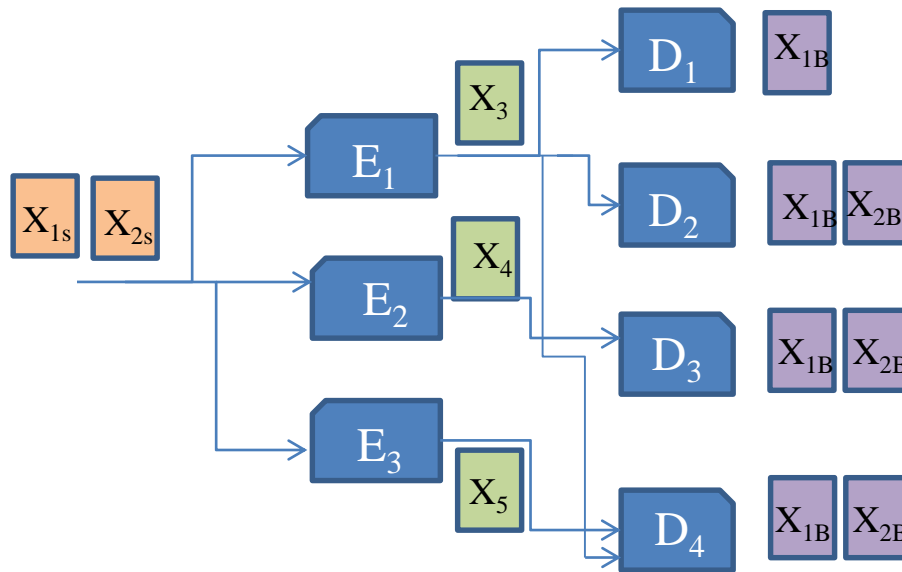
Presentation Outline

1. Motivation : Acyclic Multisource Multisink Network coding Region of capabilities: Max flow framework & Data Storage Scenario
2. Rate Region Implicit & exact Characterization
3. Polymatroid axioms & Matroids & Rate region Entropic Vectors
Inner bounds, Representable matroids are Entropic
4. Entropic vectors enumeration: Analytical enumeration of binary linear codes
5. **Algorithm to evaluate codes** that achieve Network Rate region



6. Algorithm to Evaluate Codes that Achieve Rate region of a Given Network

Variables and Constraints from Network Topology



Source Variables

$$X_{1s} = [X_{1s}^1, X_{1s}^2]$$

$$X_{2s} = [X_{2s}^1, X_{2s}^2, X_{2s}^3, X_{2s}^4]$$

Auxiliary Variables

$$X_3 = U_1 = [X_3^1, X_3^2, X_3^3]$$

$$X_4 = U_2 = [X_4^1, X_4^2, X_4^3]$$

$$X_5 = U_3 = [X_5^1, X_5^2, X_5^3]$$

Encoder Constraints

$$h_{12} = h_{123}$$

$$h_{12} = h_{124}$$

$$h_{12} = h_{125}$$

Decoder Constraints

$$h_3 = h_{13}$$

$$h_{34} = h_{1234}$$

$$h_{35} = h_{1235}$$

$$h_{45} = h_{1245}$$

Demanded Variables

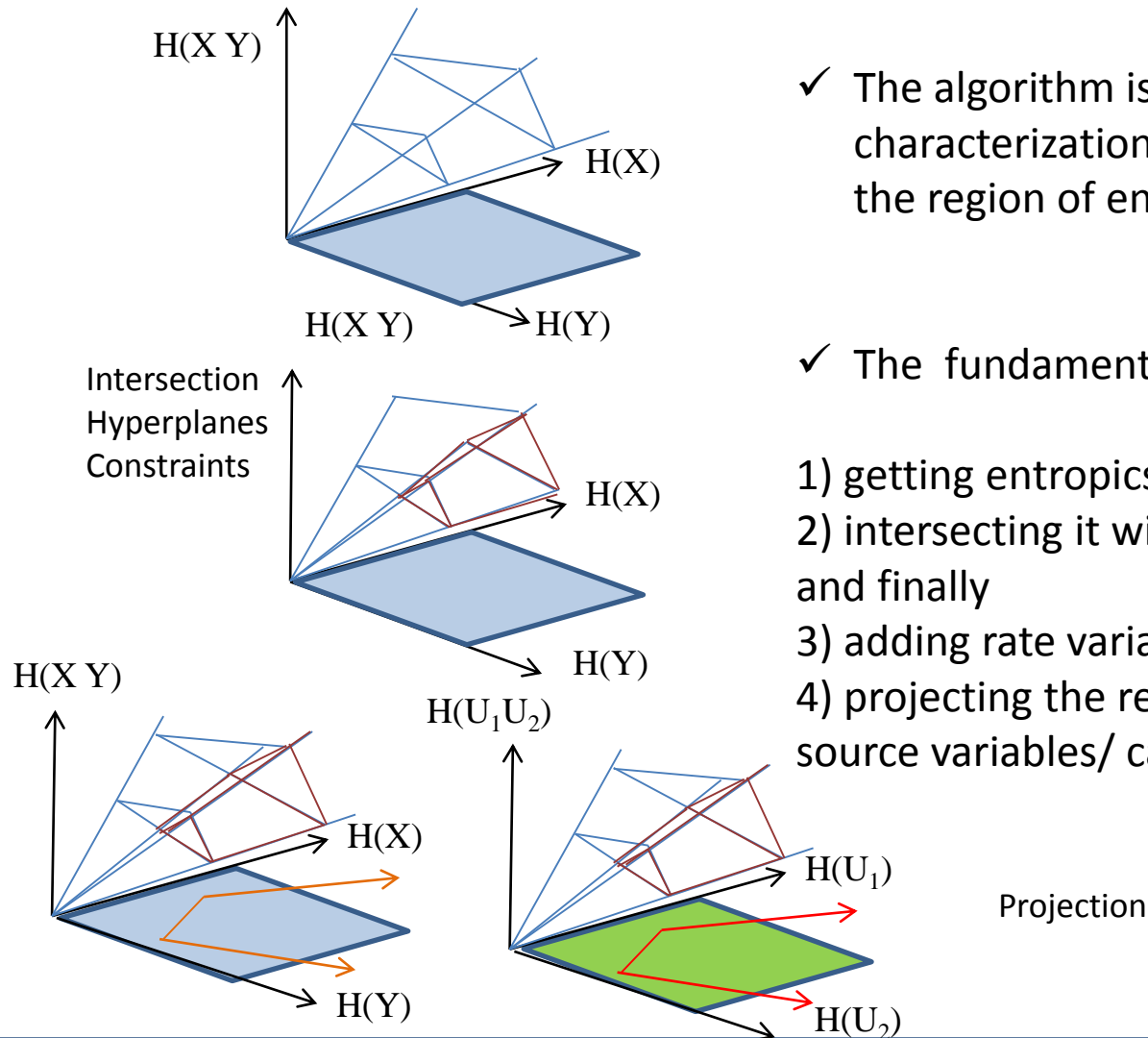
$$X_{1B} = [X_{1B}^1, X_{1B}^2]$$

$$X_{2B} = [X_{2B}^1, X_{2B}^2, X_{2B}^3, X_{2B}^4]$$

Var X_1 and X_2 must be full rank

Solution: How to find rate region of a Network using Entropic Vectors.

Algorithm to evaluate codes that achieve Network Rate region.



✓ The algorithm is based on the exact characterization of the Rate region using the region of entropic vectors.

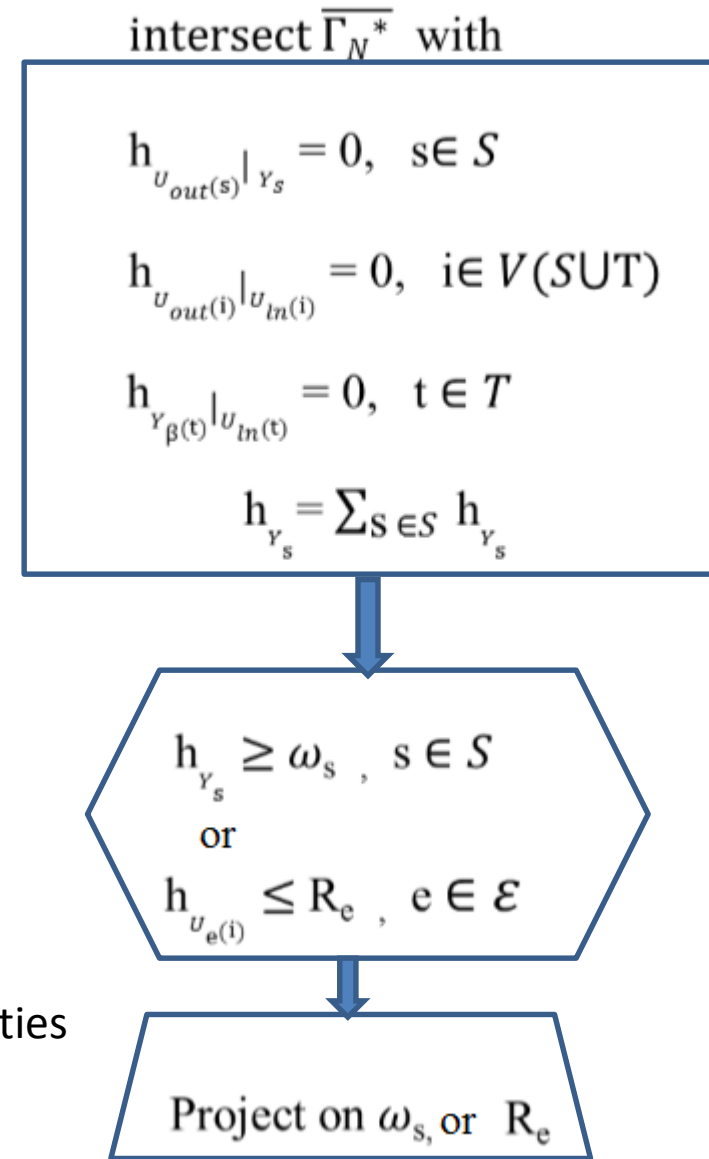
✓ The fundamental steps are :

- 1) getting entropics vectors data,
- 2) intersecting it with hyperplanes constraints and finally
- 3) adding rate variables
- 4) projecting the result downward to Network source variables/ capacities plane.

Solution: How to find rate region of a Network using Entropic Vectors.

Algorithm to evaluate codes that achieve Network Rate region.

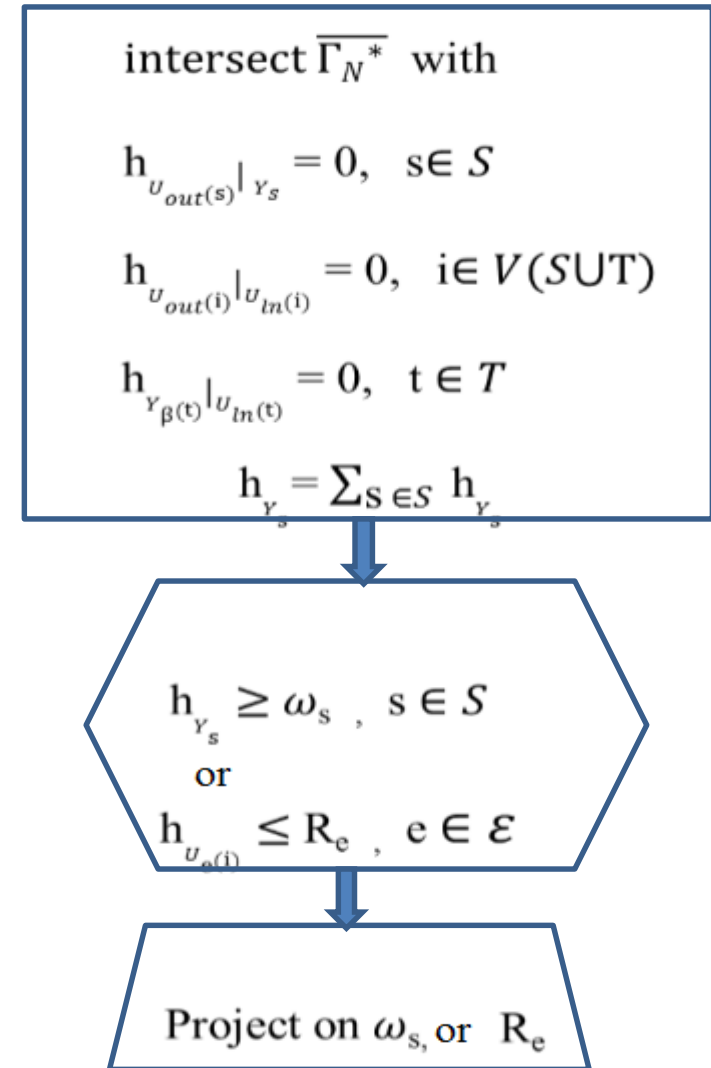
1. We extract entropies from the non isomorphic binary linear codes for all possible values we can assign to source and auxiliary variables from each of the codes looping for different possible bits per variable.
2. The constraints depend on the Topology of the Network, they represent hyperplanes that cut it.
3. We need to add the rates that we are interested into optimize.
4. Final we need to project into the corresponding rates plane to find the polymatroids that inequalities representation of the rate region.



Solution: How to find rate region of a Network using Entropic Vectors.

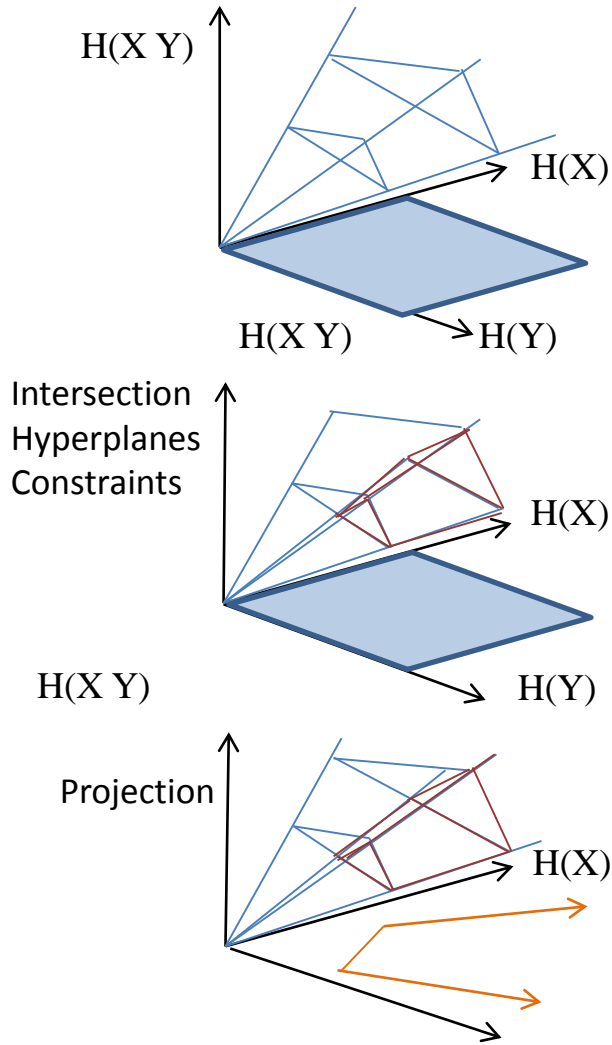
Algorithm to evaluate codes that achieve Network Rate region.

- ✓ Exploring every ray to see if it is included.
- ✓ Looping for different combinations of entropies and bits per variable ,
- ✓ Every time we need to eliminate Redundancies w.r.t to other variables.
- ✓ Evaluate encoding and decoding constraints for all possible entropies and bits,
- ✓ considering that the source variables must be linearly independent.
- ✓ Our strategy is to find at least one binary linear code satisfying constraints, per each selection of entropies and bits , per ray, this will determine the form of the convex cone of the region of entropic vectors.



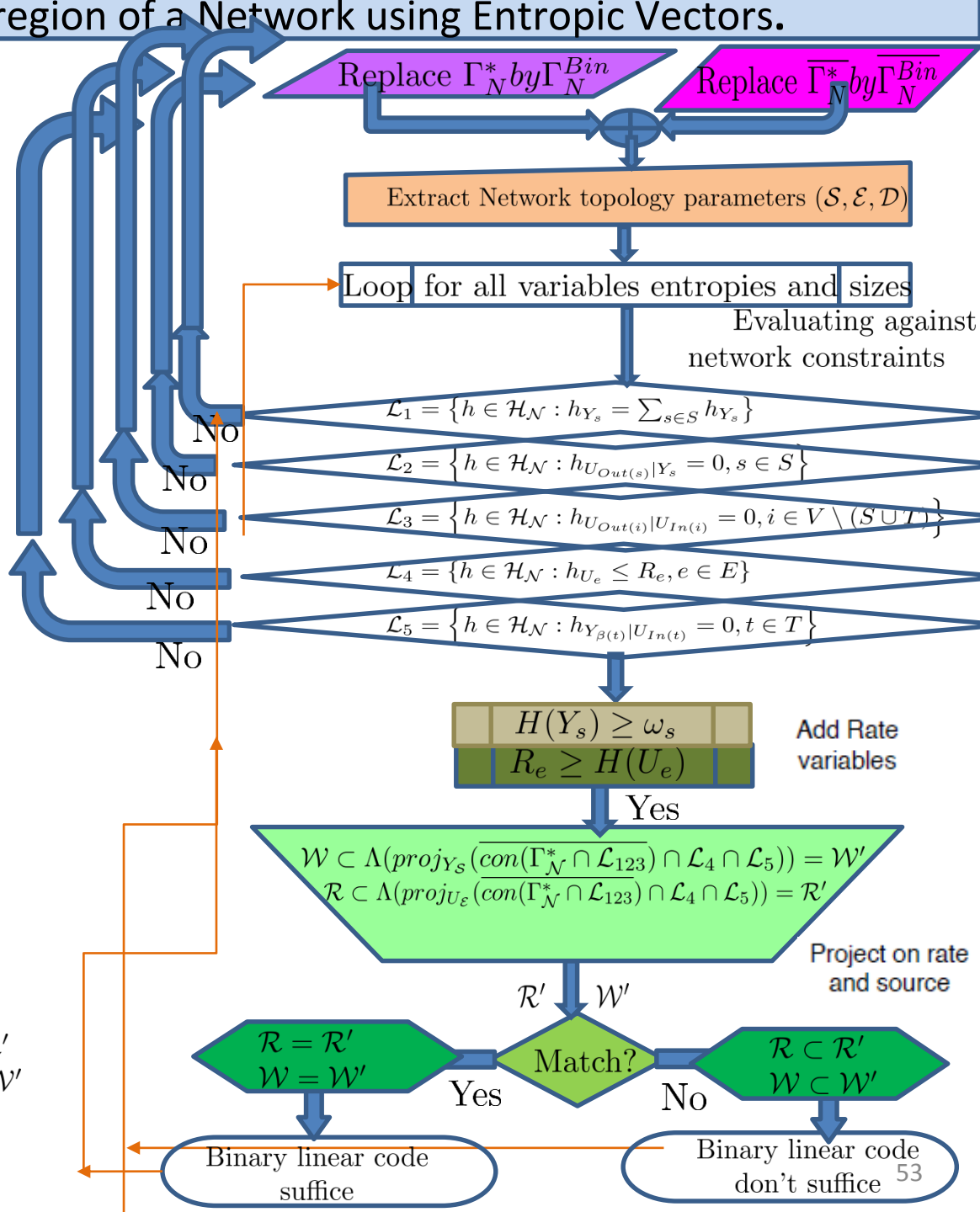
Solution: How to find rate region of a Network using Entropic Vectors.

Practical Algorithm compute General Rate region



$$\mathcal{R} = \mathcal{R}'$$

$$\mathcal{W} = \mathcal{W}'$$



Solution: How to find rate region of a Network using Entropic Vectors.

Algorithm Description:

Combinations of all variable sizes are computed between 1 and A_n —number of variables -1 ,

(No variable can have zero bits and when the variable is at its maximum size, bits must be reserved for the remaining other variables).

The inputs of the functions are:

1. Combinations structure called comb,
2. The ray that is at that particular stage being explored
3. The code it is checked to be possibly achieving the rate region.

Solution: How to find rate region of a Network using Entropic Vectors.

A ray is defined as a tuple of entropies (source and auxiliary variables)
, is a vector.

For each variable, the program loop from its entropy to
 $A_n - \sum_{v \in \text{Notyetselected}} h_v - \sum_{u \in \text{Alreadyselected}} \text{bits}_u$,

where A_n is the number of columns, code length.

Size of variable can't be less than its entropy and can't be
so large such that one or more of the other variables become of size
smaller than their respective entropies.

Solution: How to find rate region of a Network using Entropic Vectors.

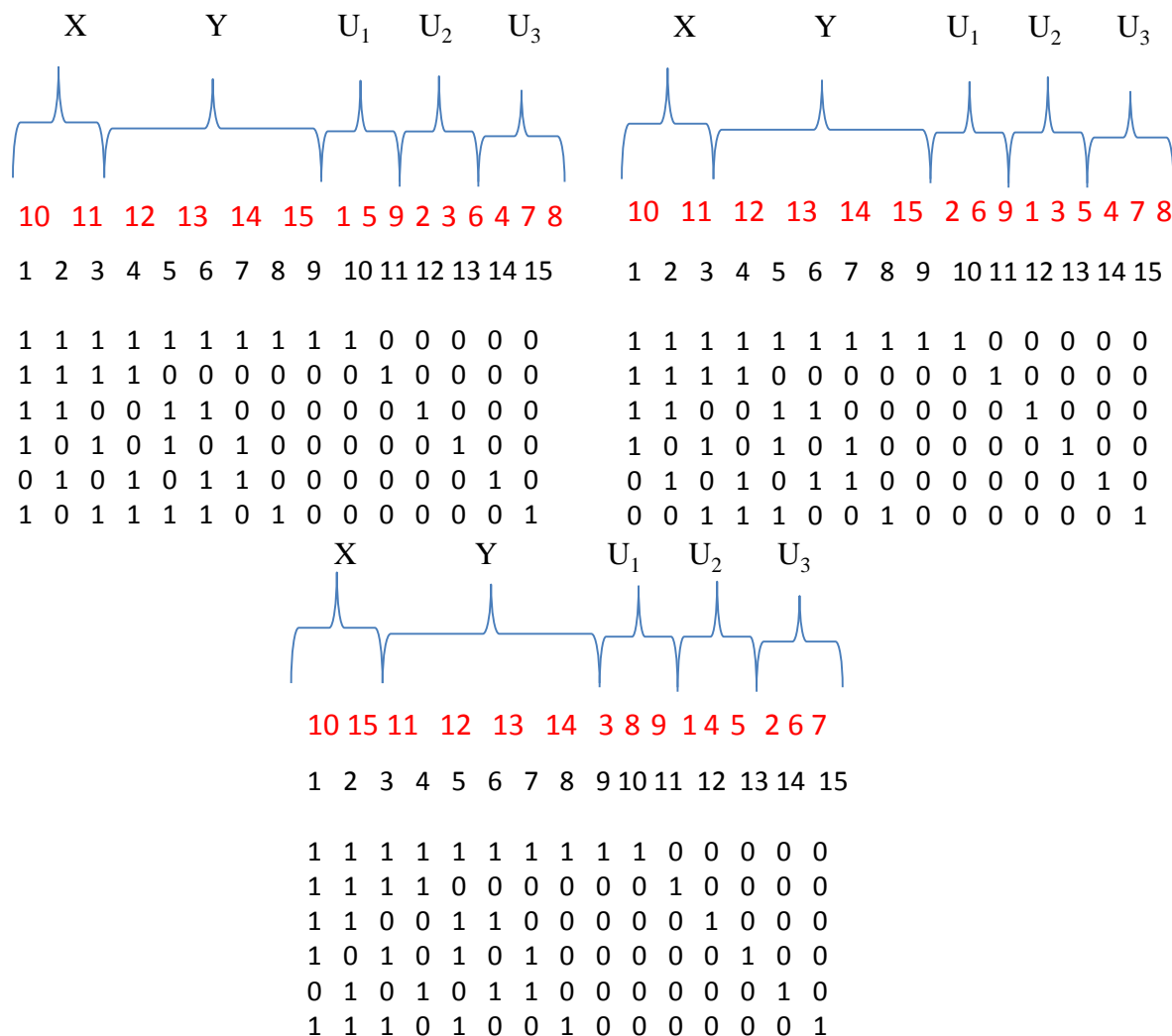
Given a variable size, loop through all combinations that are stored in the structure comb of that same size.

Along every loop redundancies are checked w.r.t. the variables previously fixed and the entropies are checked against network constraints.

If conditions are not satisfied, then move to next possible combination, otherwise it is moved to the next variable.

A constrained permutation approach is applied, if we find that for some entropies assigned to some variables there are constraints not matched, we don't continue exploring on permutations that are derived from that assignation of entropies. We prune that branch from the tree of permutations.

6. Algorithm to Evaluate Codes that Achieve Rate region of a Given Network



3 codes that were tested and achieved a ray (2 4 3 3 3) of the rate region .

6. Algorithm to Evaluate Codes that Achieve Rate region of a Given Network

RRrep3	RRrep3Rd
V-representation	*row 2 was redundant and removed
begin	V-representation
5 6 integer	begin
0 1 1 1 1 2	4 6 rational
0 1 1 1 1 3	0 1 1 1 1 2
0 1 1 1 1 4	0 1 1 1 1 4
0 2 4 3 3 3	0 2 4 3 3 3
0 1 2 2 1 4	0 1 2 2 1 4
end	end
	*Input had 5 rows and 6 columns: 1 row(s)
	redundant*redund:lrslib v.4.3
	2012.6.1(32bit,lrsmp.h) max
	digits=8/100*0.000u 0.015s 4324Kb 1147 flts 0
	swaps 0 blks-in 0 blks-out

6. Algorithm to Evaluate Codes that Achieve Rate region of a Given Network

```
RRrep3Rd
H-representation
linearity 1 1
begin
***** 6 rational
0 -1 -1 1 1 0
0 4 -5 5 0 -1
0 -1 -1 2 0 0
0 0 3 -5 0 1
0 0 1 -1 0 0
end
*Totals: facets=4 bases=1 linearities=1
facets+linearities=5*Irs:Irslib v.4.3
2012.6.1(32bit,Irsmp.h) max
digits=8/100*0.015u 0.000s 4324Kb 1147 flts 0
swaps 0 blks-in 0 blks-out
```

6. Algorithm to Evaluate Codes that Achieve Rate region of a Given Network

RRrep3Rd

H-representation

begin

11 9 rational

0 -1 -1 1 1 0 0 0 0

0 4 -5 5 0 -1 0 0 0

0 -1 -1 2 0 0 0 0 0

0 0 3 -5 0 1 0 0 0

0 0 1 -1 0 0 0 0 0

0 0 0 -1 0 0 1 0 0

0 0 0 0 -1 0 0 1 0

0 0 0 0 0 -1 0 0 1

0 0 0 0 0 0 1 0 0

0 0 0 0 0 0 0 1 0

0 0 0 0 0 0 0 0 1

$X_1 X_2 U_1 U_2 U_3 R_1 R_2 R_3$

end

*Totals: facets=4 bases=1 linearities=1

facets+linearities=5*lrs:lrslib v.4.3

2012.6.1(32bit,lrsmp.h) max digits=8/100*0.015u

0.000s 4324Kb 1147 flts 0 swaps 0 blks-in 0 blks-out

Conclusions

Integrating the research carried out in Network coding of Z.Zheung, X.Yan and R.Yeung,
under the information theory most recent progresses reported by T.Chan with the methods developed for the enumeration construction of binary linear codes of M.Wild and R.Laue,
a suitable method of finding the rate region for acyclic multisink multisources Networks was proposed.

The method is based on the use of results of analytic enumeration of binary linear codes
carried out with Computational Group theory and
an algorithm designed to test them against all the constraints of a network using constrained permutation.

The exact characterization of the Network coding Rate region w.r.t the entropic region (under bounding this one) was used to develop a General strategy of its computation. based on representable matroids.

In particular, this is an approach that can be used to find solution of two importantnet Network coding problems as the Max flow and the Distributive storage.

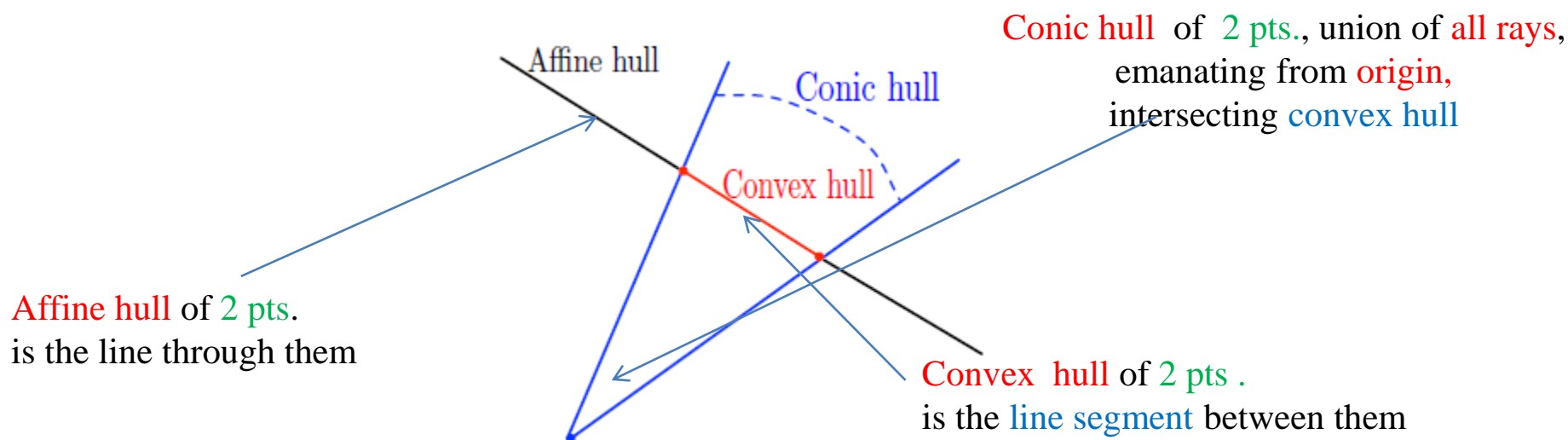
Appendix. Entropic Region, its Closure and Properties. (Convex Hull)

Entropic region Closure is a Polyhedral Cone

The **affine hull** of S : $\text{aff}(S) = \left\{ \sum_{i=1}^k \alpha_i x_i \mid k > 0, x_i \in S, \alpha_i \in \mathbb{R}, \sum_{i=1}^k \alpha_i = 1 \right\}.$

The **convex hull of S** : $\text{Conv}(S) = \left\{ \sum_{i=1}^{|S|} \alpha_i x_i \mid (\forall i : \alpha_i \geq 0) \wedge \sum_{i=1}^{|S|} \alpha_i = 1 \right\}.$

The **conic hull of S** : $\text{cone}(S) = \left\{ \sum_{i=1}^k \alpha_i x_i \mid x_i \in S, \alpha_i \in \mathbb{R}, \alpha_i \geq 0, i, k = 1, 2, \dots \right\}.$



Entropic Region includes all Valid Entropic vectors

$$\mathcal{H}_N = \mathbb{R}^{2^N - 1}$$

$$\Gamma_N^* = \{h \in \mathcal{H}_N : h \text{ is entropic}\}$$

$\overline{\Gamma_N^*}$ is a convex cone.

Not All the Euclidean Space is Entropic

2. Rate Region Implicit Characterization by Yan & Yeung.

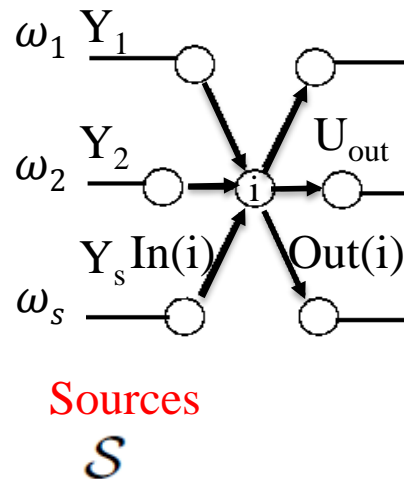
Network sources Rate Region

Source rate

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

Sources Independence

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



Source Encoding

$$H(U_{out(s)}|Y_s) = 0$$

$$\mathcal{W} = \{ W: W \text{ is admissible, where } W = \{\omega_s, s \in \mathcal{S}\} \}$$

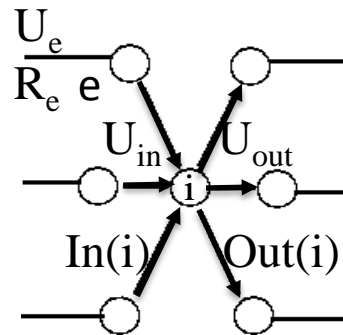
Admissible Rate Region

Admissible Rate Vectors

2. Rate Region Implicit Characterization by Yan & Yeung.

Network coding Rate Region

Channels encoding rates
vs
entropies of Aux.Var.
 $\mathcal{R}_e \geq H(U_e)$
 $e \in \mathcal{E}$



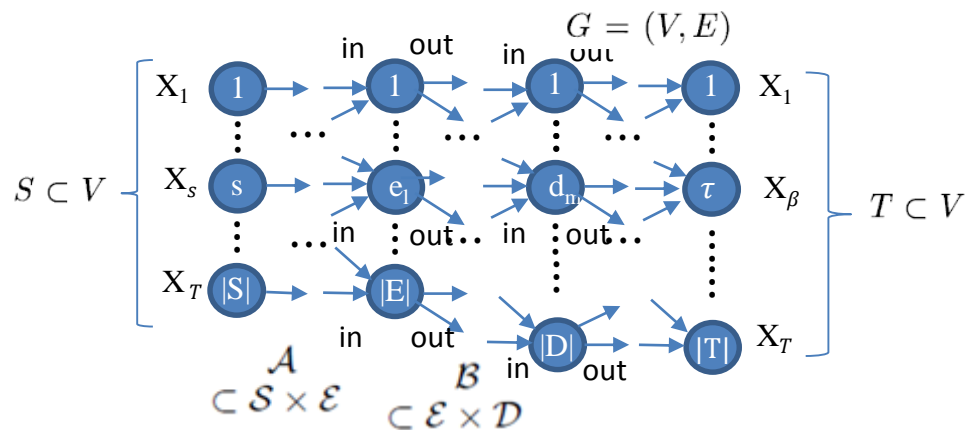
Int. nodes
encoding constraints
 $H(U_{out(i)}|U_{In(i)}) = 0$
 $i \in \mathcal{V} \setminus (\mathcal{S} \cup \mathcal{T})$

$$\mathcal{R} = \{ \mathbf{R}: \mathbf{R} \text{ is admissible, where } \mathbf{R} = \{R_e, e \in \mathcal{E}\} \}$$

Admissible Rate Region

Admissible Rate Vectors

2. Rate Region Implicit Characterization by Yan, Yeung & Zhang.



Sources Encoding function

$$s \in \mathcal{S}, e \in \text{Out}(s)$$

$$k_e: \mathcal{X}_s = \{1, 2, \dots, 2^{n\tau_s}\} \rightarrow \{0, 1, \dots, \eta_e - 1\}$$

Nodes Encoding function

$$e \in \text{Out}(i), i \in V \setminus (\mathcal{S} \cup \mathcal{T})$$

$$k_e: \prod_{d \in \text{In}(i)} \{0, 1, \dots, \eta_d - 1\} \rightarrow \{0, 1, \dots, \eta_e - 1\}$$

Decoding function

$$g_t: \prod_{d \in \text{In}(i)} \{0, 1, \dots, \eta_d - 1\} \rightarrow \mathcal{X}_{\beta(t)}$$

$(n, (\eta_e : e \in \mathcal{E}, (\tau_s : s \in \mathcal{S})))$ block code of length n is:

X_s information r.v. $s \in \mathcal{S}$
taking values in $\mathcal{X}_s = \{1, 2, \dots, [2^{n\tau_s}]\}$

τ_s inf. s.r.

η_e inf. n.r.

At $t \in \mathcal{T}$

$X_\beta(t), \beta(t) \in \mathcal{S}$

Appendix. Matching inner and outer bounds for full characterization of the entropic region.

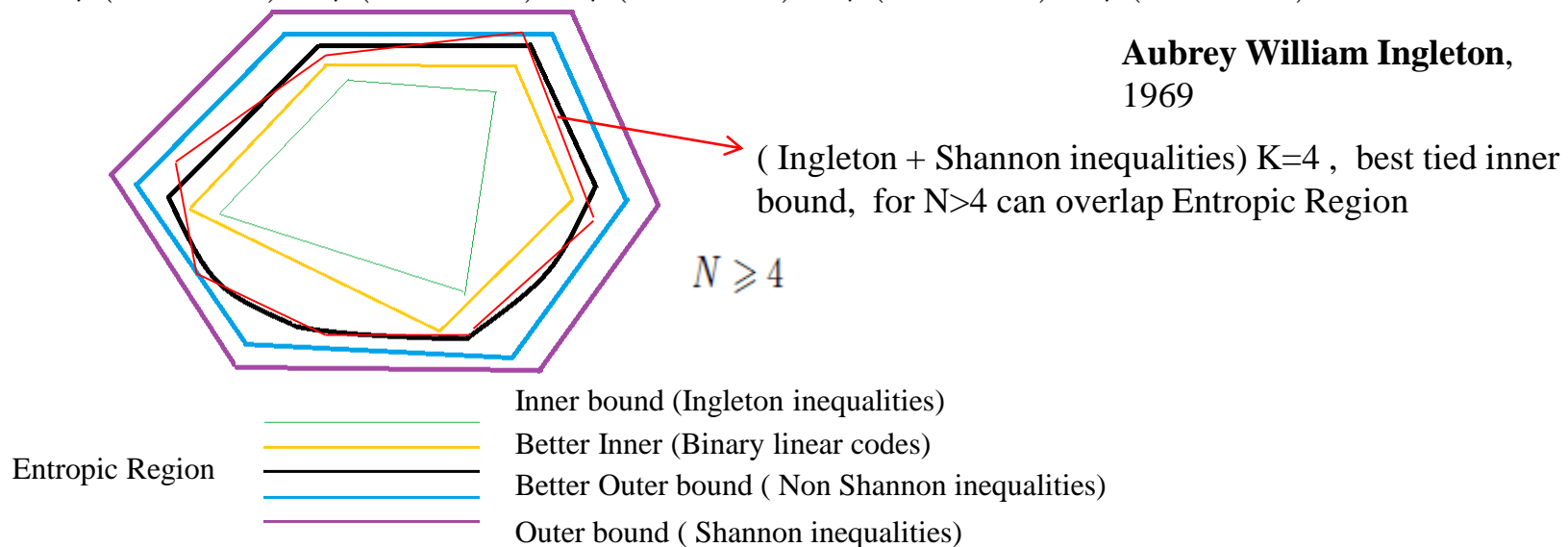
Why not other Outer and inner bounds instead ?

Ingletons Inequality , $\mathcal{M}(E, I, \rho)$ be matroid , ρ rank function

$$\forall X_1, X_2, X_3, X_4 \subseteq E,$$

$$\rho(X_1) + \rho(X_2) + \rho(X_1 \cup X_2 \cup X_3) + \rho(X_1 \cup X_2 \cup X_4) + \rho(X_3 \cup X_4) \\ \leq \rho(X_1 \cup X_2) + \rho(X_1 \cup X_3) + \rho(X_1 \cup X_4) + \rho(X_2 \cup X_3) + \rho(X_2 \cup X_4)$$

Aubrey William Ingleton,
1969

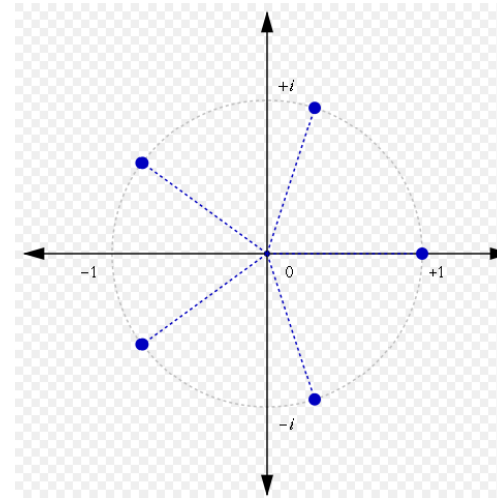
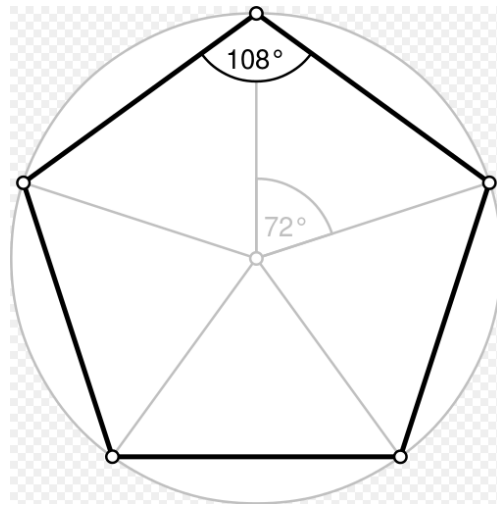


First discovered Non-Shannon-Type Information Inequality:

$$2I(X_3; X_4) \leq I(X_1; X_2) + I(X_1; X_3, X_4) + 3I(X_3; X_4|X_1) + I(X_3; X_4|X_2)$$

Z. Zhang & R. Yeung 1997

Appendix. Entropic vectors enumeration: Analytical enumeration of binary linear codes (Isomorphic Objects in symmetries)



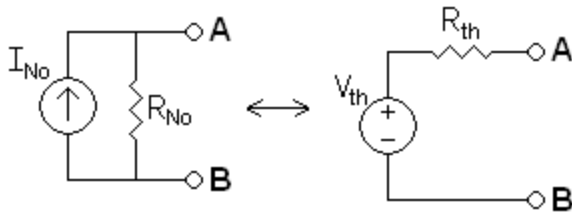
The group of fifth **roots of unity** under multiplication is **isomorphic** to the group of **rotations of the regular pentagon** under composition.

So, in listing codes, w.r.t. performance for testing them in a network, we must **avoid double counting** the ones that produce exactly the same effect. We need to **test non-isomorphic codes**.

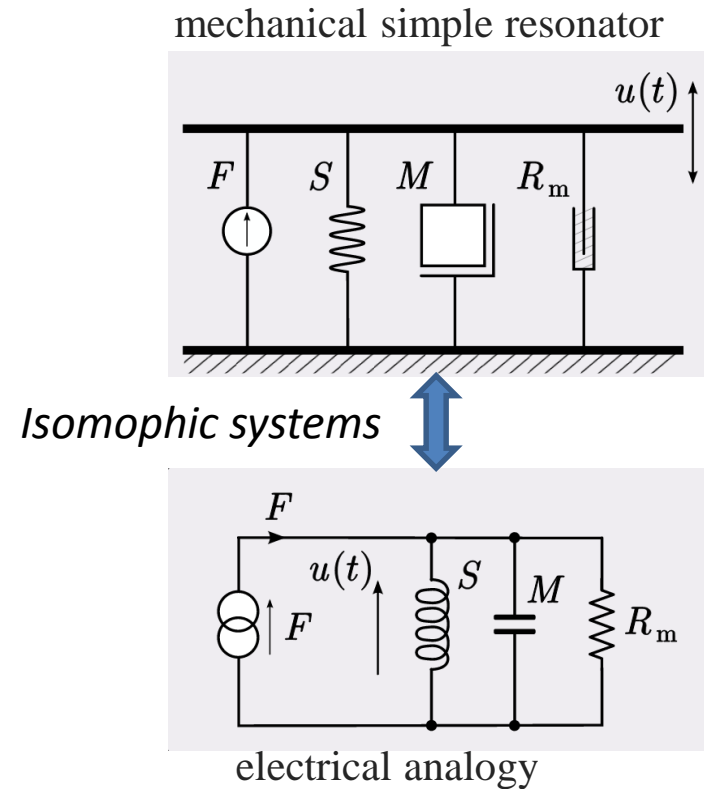
Appendix. Entropic vectors enumeration: Analytical enumeration of binary linear codes (Isomorphic classes)

In classifying systems we need to avoid to double count the ones that are **system analog models**.

$$R_{th} = R_{no} ; V_{th} = I_{no} R_{no} ; \frac{V_{th}}{R_{th}} = I_{no}$$



Norton's theorem and Thévenin's theorem offers an *isomorphism class* of electrical circuits..



✓ binary linear codes- Abstract Algebra Perspective – Dr. Marcel Wild research.

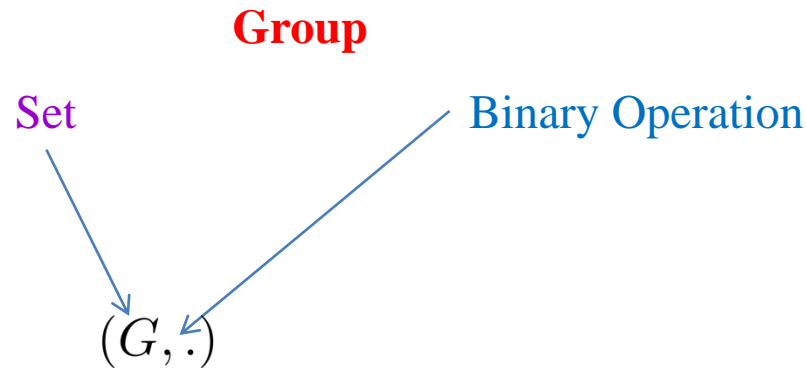
1st step: From counting of orbits to averaging fix points.

- ✓ Groups
- ✓ Cauchy-Frobenius Counting Lemma
- ✓ Set Transversal under a group action
- ✓ group Action set permutation representation.
- ✓ Orbits Equivalence classes
- ✓ Group action orbit space
- ✓ Group action Partitions of finite sets.
- ✓ Orbits enumeration – fix points Average.
- ✓ Groups for binary linear matroid isomorphic classes enumeration.

$$b(n, \leq r) = \frac{\sum_{(A, \pi) \in GL_r^2 \times S_n} |Z_{A, \pi}|}{|GL^2| |S_n|}$$

Appendix. Entropic vectors enumeration: Analytical enumeration of binary linear codes

Group conceptualization



Closure

$$\forall a, b \in G, a \cdot b \in G$$

Associativity

$$\forall a, b, c \in G, (a \cdot b) \cdot c = a \cdot (b \cdot c)$$

Identity element

$$\exists e \in G, \text{ s.t. } \forall a \in G, e \cdot a = a \cdot e = a$$

Inverse element

$$\forall a \in G, \exists b \in G \text{ s.t. } a \cdot b = b \cdot a = e, e \in G$$

Appendix. Entropic vectors enumeration: Analytical enumeration of binary linear codes

Transversal of orbits and the partition determined by a group action of a finite set.

Transversal

⌊ C be collection of sets, transversal $F \subset C$, F contains exactly one $x \in c \subset C$.
if $\forall i,j \ c_i \cap c_j \neq \emptyset$, $c_i, c_j \in C$, each $f \in F$ corresponds to exactly one $c \in C$

Transversals and Partitions

As $x \sim_G x' \leftrightarrow \exists g \in G \text{ s.t. } x' = gx$,
 $\therefore F$ yields a set partition of X , dissected into pairwise disjoint and nonempty subsets $G(t), t \in F$

$$X = \bigcup_{t \in F} G(t)$$

$$\therefore G \backslash \backslash X := \{G(t) | t \in F\}$$

Appendix. Entropic vectors enumeration: Analytical enumeration of binary linear codes

Given an element

$$x \in X$$

Orbit of an element:

$$Gx := \{g \cdot x | g \in G\}$$

Orbit Space:

$$G \backslash X := \{Gx | x \in X\}$$

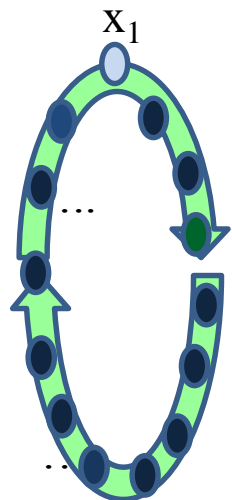
Orbits in X under the Action of group G

Orbits \Leftrightarrow

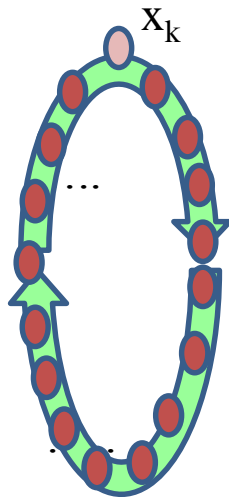
Permutations

$$Gx = \{g_k x_i = x_j | x_i, x_j \in X, g \in G\}$$

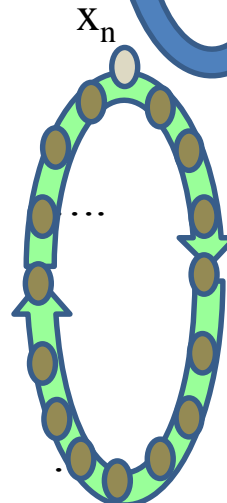
$$g_1 x \cup g_2 x \cup \dots \cup g_n x = Gx$$



$$Gx_1 \cup \dots$$

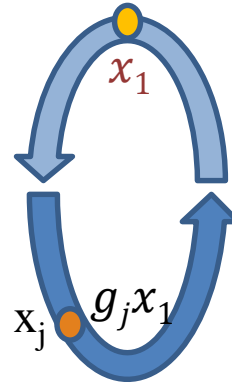
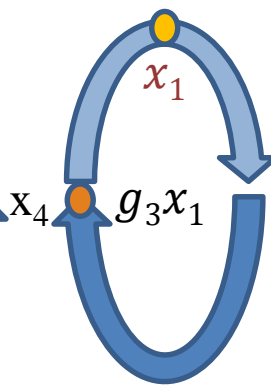
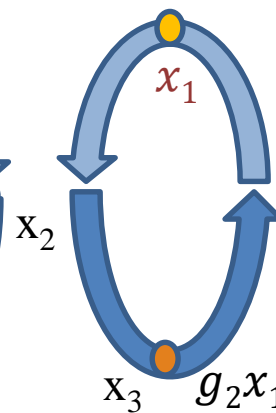
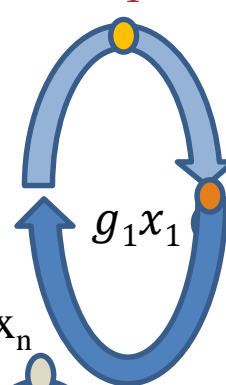


$$Gx_k \cup \dots$$



$$\cup Gx_n$$

$$= G \backslash X$$

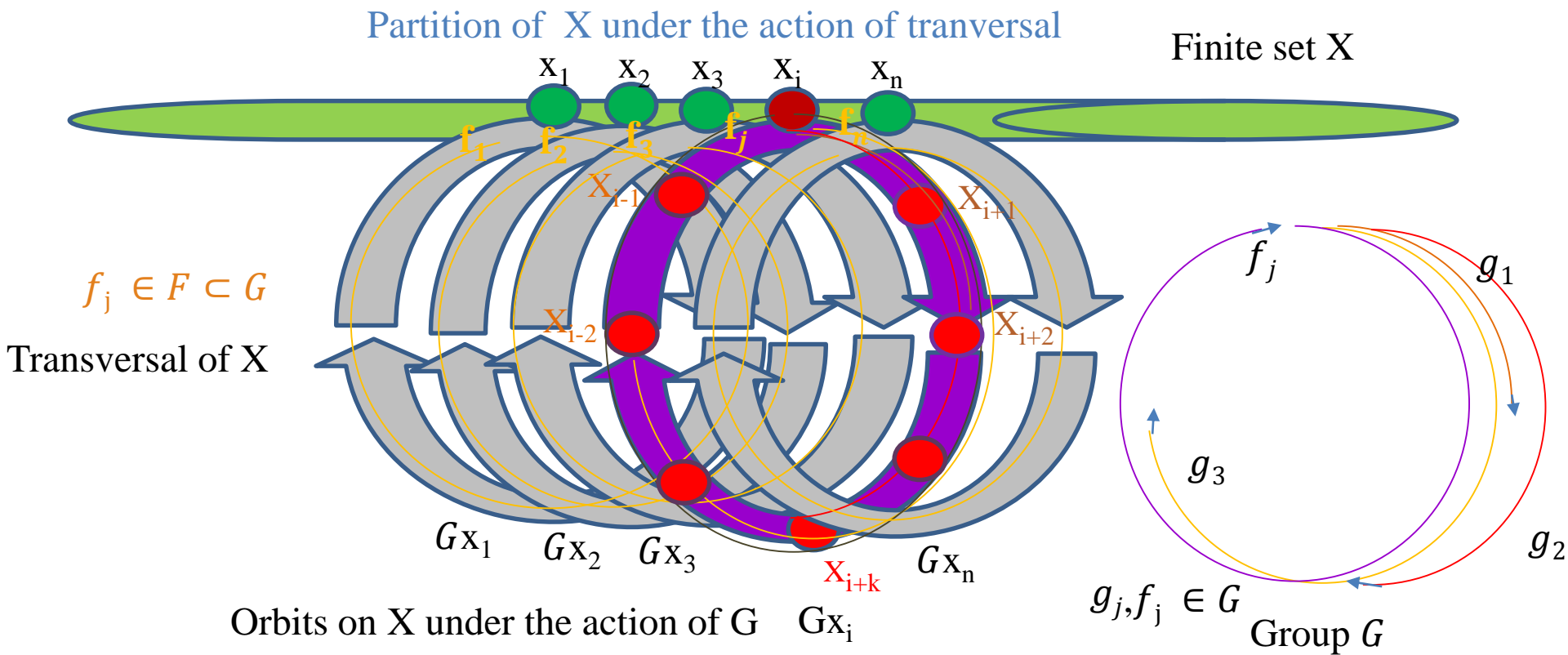


Orbit Space of a Group Action

Appendix. Entropic vectors enumeration: Analytical enumeration of binary linear codes

A group acting on a finite set determines a partition on it.

The set of orbits of points $x \in X$, under action of G , form a partition of X



Group Actions and Partitions

Each set partition of $X \rightarrow$ action of a certain group on X .

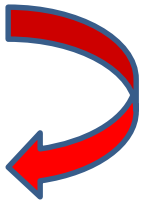
$\sqcup X_i$, where $i \in I$, an index set,

A partition of pairwise disjoint, nonempty sets of X .

$\exists S_x X$ and has orbits X_i ,

$$\bigoplus_i S_{x_i} := \{\pi \in S_x \mid \forall i \in I : \pi X_i = X_i\}$$

Lemma: $Gx \equiv$ a permutation representation of G on X and
 \rightarrow a set partition of X into orbits.



\Leftarrow , each set partition of $X \leftrightarrow$ to an action of certain subgroup of S_x which
has blocks of the partition as its orbits.

An Action of a group in a finite
set equivalent to a permutation
representation of the set.

Conjugacy Classes of a Group

Conjugacy

group may be partitioned into conjugacy classes;

Suppose G a group. $a, b \in G$ are called conjugate if
 $\exists g \in G$ with $gag^{-1} = b$, $\Leftrightarrow a \sim b$

, it partitions G into equivalence classes.

\Rightarrow every $g \in G$ belongs to precisely one conjugacy class,
classes $Cl(a) = Cl(b)$ iff $a = g^{-1}bg$, and disjoint otherwise.

Conjugacy class of S_n group

The conjugacy class containing $a \in G$ is

$$Cl(a) = \{gag^{-1} : g \in G\}$$

Conjugacy classes of the
symmetric group of
permutations.

Conjugacy Classes of The Product of Two Groups

Theorem

┐ G, H be groups, with sets of conjugacy classes C_G and C_H respectively. \therefore , if $C_{G \times H} = \{A \times B : A \in C_G, B \in C_H\}$

In our problem the total number of conjugacy classes is
 $|C_\lambda||D_\mu|$

Main Program **Run_Testing_Code**

Section 1: **Import Data from Binary linear Codes Enumeration Construction.**

Import JSON file containing non-isomorphic binary linear codes using **JsonLab** *Matlab* package

Section 2: **Browsing File of Imported Codes**

Code_types structure to be tested is loaded to be iterated using a For-loop.
A code from the structure to be tested is uploaded in the **variable Code_names**
Code_names is declared as to be binary array.

Appendix. Algorithm to Evaluate Codes that Achieve Rate region of a Given Network

Main Program **Run_Testing_Code**

Section 3: **Generating possible choices for Variables**

Run **Create_combinations** function to return all possible variable candidates

Section 4: **Testing Code to Achieve Rate Region**

Run **Testing_code** function to test the code against constraints

If **Code** achieves rate region **Testing_code** returns successful permutation

If **Code** does not achieve rate region **Testing_code** returns 0.

Section 5 **Archiving Codes that achieve Network Rate Region**

Successful permutations are archived in the *Matlab* structure **all_types**.

Code_types(code_type).Code_names(code_name).code archives codes that achieve Network rate region.

Code_types(code_type).Code_names(code_name).partition archives successful permutation partition.

Function Create_combinations

Arguments

✓ 15 Columns binary linear **Code**

Value Returned

- ✓ Combinations of 2 columns out of 6 in Array **C**,
- ✓ Combinations of 4 columns out of 6 in Array **D**,
- ✓ Combinations of 3 columns out of 9 in Array **E**.

General Algorithm

- ✓ Use **choosek** *Matlab* function to compute combinations in **C**, **D**, **E**.
- ✓ Index columns of **Code** from combinations of **C**, **D**, **E** by vectorization.
- ✓ Compute entropy of **Code** columns for each combination in **C**, **D**, **E**.

Appendix .Algorithm to Evaluate Codes that Achieve Rate region of a Given Network

Function Testingcode

Arguments

- ✓ Combination Array of 3 out of 15,
- ✓ Combination Array of 4 out of 15,
- ✓ Combination Array of 2 out of 15,
- ✓ Binary linear code to be tested.

Value Returned

- ✓ A permutation of column vectors that match all the constraints.
- ✓ Control is sent back to main program, **Run_Testing_Code**.

General Architecture

- ✓ **5 Nested for-loops**, one for each of the 2 source variables & 3 auxiliary ones
- ✓ **Succession of If-statements** nested in the loops to evaluate the constraints.

Appendix. Algorithm to Evaluate Codes that Achieve Rate region of a Given Network

Function Testingcode

Variable candidates

- ✓ Fix source variables from the identity matrix, to assure linear independence.
- ✓ 3 Auxiliary variables from remaining bits of the original binary linear code.

Selecting candidates

- ✓ Variable candidates are checked against **Permute** to prevent redundancy
 - ✓ Add selected variables to **Permute**
- ✓ **Permute** stores current permutation tree branch

Constrained permutation tree pruning

- ✓ Entropy constraints are checked before a branch is added to **Permute**
 - ✓ **Permute** indexes **Code** by vectorization to compute ranks.
 - ✓ When a branch fails, **Permute** is reset.

Appendix: Implicit Characterization of rate region from Entropic Vectors.

Network Rate Region from Entropic Region

- ✓ Compute Entropic Region , then its Closure
- ✓ Entropic region Closure intersected Network Topology equalities
- ✓ Projected onto a series of Capacities Variables

It solves fundamental limits, boundaries of the set.

1. Its unknown if they actually can be computed.
2. We want to substitute something that is outside of the set for something that is inside of it.
3. After intersection and projection we get 2 things which match.
4. The answer is in the sandwich in between the two.

$$\Upsilon(A) = \{\mathbf{r} \in \mathbb{R}^{|\mathcal{E}|}: \mathbf{r} \geq \mathbf{r}' \text{ for some } \mathbf{r}' \in A\}$$

$$\mathcal{R}_{\text{in}} \subset \mathcal{R} \subset \mathcal{R}_{\text{out}}$$

$$\mathcal{R}_{\text{in}} = \overline{\Upsilon(\text{proj}_{(h_{Z_I}, I \in \mathcal{E})}(\Gamma_N^* \cap C_1 \cap C_2 \cap C_3 \cap C_4))}.$$

$$\mathcal{R}_{\text{out}} = \Upsilon(\text{proj}_{(h_{Z_I}, I \in \mathcal{E})}(\bar{\Gamma}_N^* \cap C_1 \cap C_2 \cap C_3 \cap \bar{C}_4))$$

2. Yan, Yeung & Zhang Implicit Characterizing of Rate Region.

$$\Upsilon(A) = \{\mathbf{r} \in \mathbb{R}^{|\mathcal{E}|}: \mathbf{r} \geq \mathbf{r}' \text{ for some } \mathbf{r}' \in A\}$$

$$\mathcal{R}_{\text{in}} = \overline{\Upsilon(\text{proj}_{(h_{Z_l}, l \in \mathcal{E})}(\Gamma_N^* \cap C_1 \cap C_2 \cap C_3 \cap C_4))}.$$

$$\mathcal{R}_{\text{out}} = \Upsilon(\text{proj}_{(h_{Z_l}, l \in \mathcal{E})}(\bar{\Gamma}_N^* \cap C_1 \cap C_2 \cap C_3 \cap \bar{C}_4))$$

$$\mathcal{R}_{\text{in}} \subset \mathcal{R} \subset \mathcal{R}_{\text{out}}$$

Appendix: Rate Region Implicit Characterization by Yan, Yeung & Zhang.
implicit Rate Region expressions

$$\begin{aligned}
 \Upsilon(A) &= \{\mathbf{r} \in \mathbb{R}^{|\mathcal{E}|} : \mathbf{r} \geq \mathbf{r}' \text{ for some } \mathbf{r}' \in A\} & \longleftrightarrow & \Lambda(\mathcal{B}) = \{\mathbf{h} \in \mathcal{H}_{\mathcal{N}} : \mathbf{0} \leq \mathbf{h} \leq \mathbf{h}'\} \quad \mathbf{h}' \in \mathcal{B} \\
 \mathcal{R}_{\text{out}} &= \Upsilon(\text{proj}_{(h_{Z_l}, l \in \mathcal{E})}(\bar{\Gamma}_N^* \cap C_1 \cap C_2 \cap C_3 \cap \bar{C}_4)) & \longleftrightarrow & \mathcal{R}_{\text{out}} = \Lambda\left(\text{proj}_{Y_S}\left(\bar{\Gamma}_N^* \cap \mathcal{L}_{123} \cap \mathcal{L}_4 \cap \mathcal{L}_5\right)\right) \\
 \mathcal{R}_{\text{in}} &= \overline{\Upsilon(\text{proj}_{(h_{Z_l}, l \in \mathcal{E})}(\Gamma_N^* \cap C_1 \cap C_2 \cap C_3 \cap C_4))}. & \longleftrightarrow & \mathcal{R}' = \Lambda\left(\text{proj}_{Y_S}\left(\overline{\text{con}(\Gamma_N^* \cap \mathcal{L}_{123})} \cap \mathcal{L}_4 \cap \mathcal{L}_5\right)\right) \\
 & & & \mathcal{R}_{\text{in}} = \overline{\text{con}(\mathcal{R}')}
 \end{aligned}$$

$$\mathcal{R}' \subset \mathcal{R}_{\text{out}}$$

$$\mathcal{R}_{\text{in}} \subset \mathcal{R} \subset \mathcal{R}_{\text{out}}$$

$$\mathbf{R} = (R_l, l \in \mathcal{E})$$

Appendix: Implicit Characterization of rate region from Entropic Vectors.

Fundamental limits in terms of Entropic Region .

Finding Network codes capacities

Unknown set - Entropic region ,

Use outer bound, and inner bound,
tie them

\exists known ways to calculate outer bound.

Vectors on Shannon outer bounds are rank functions of matroids.

We want the ones for which there is some associated matrix

$$\mathbf{r} \in \Gamma_N \cap \mathbb{Z}^{2^N-1}, \quad r(\mathcal{A}) \leq |\mathcal{A}|$$

$$\mathbf{r} \in \Gamma_N \cap \mathbb{Z}^{2^N-1} \text{ s.t. } \exists \mathbf{A} \in GF(q)^{M \times N} \Rightarrow r(\mathcal{A}) = \text{rank}(\mathbf{A}_{:, \mathcal{A}})$$

All of them are entropic, so they are an inner bound. .

Enumerating representable linear binary matroids gives an inner bound

Basic Shannon Inequalities

Def. $I(X_1; X_2 | X_3) = \sum_{X_1 X_2 X_3} p_{X_1 X_2 X_3}(X_1, X_2, X_3) \log \frac{p_{X_1, X_2 | X_3}(X_1, X_2 | X_3)}{p_{X_1 | X_3}(X_1 | X_3) p_{X_2 | X_3}(X_2 | X_3)}$

Basic Inequalities: $\forall \alpha, \beta, \gamma \subset N_n = \{1, \dots, n\}, I(X_\alpha; X_\beta | X_\gamma) \geq 0$

Information Inequalities

Inf. Expr.:

$$\forall X, Y, Z \text{ r.v. is } \sum_{X,Y,Z} C_i H(X, Y) + D_j H(X|Z) + E_k H(Y|Z)$$

$\perp f$ be an inf. expr.

Given c a constant, $f \geq c$ is an inf. ineq.

$f = c$ is an inf. id.

Information inequalities govern impossibilities in inf. Th.

Non-Shannon Inequalities:

Inf. Inequalities that aren't implied by Basic Ineq.

Shannon Inequalities:

Inf. Inequalities that are implied by Basic Ineq.

Information Inequalities

Consider

$$\mathcal{H}_{\mathcal{N}} = \mathbb{R}^{2N-1}$$

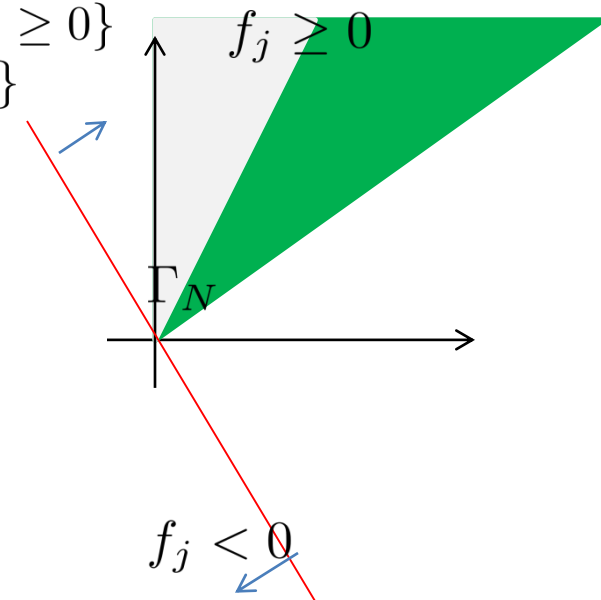
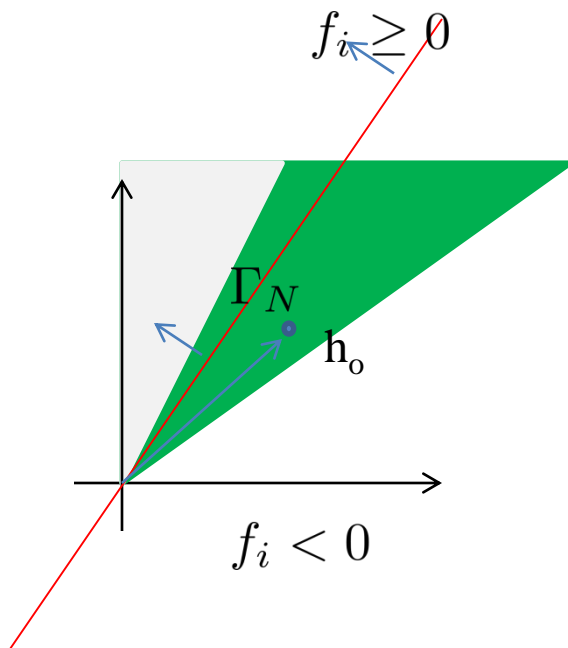
$$\Gamma_N^* = \{h \in \mathcal{H}_{\mathcal{N}} : h \text{ is entropic}\}$$

$\overline{\Gamma_N^*}$ its convex cone.

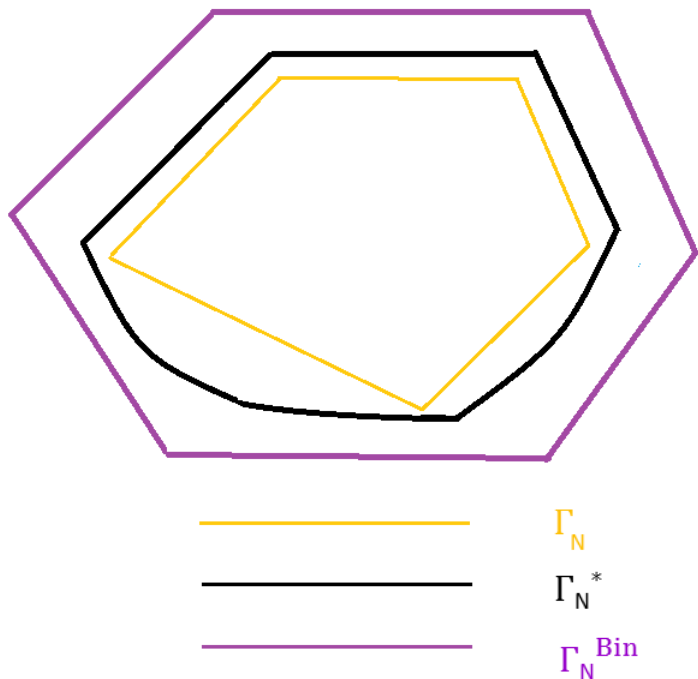
$$f_i \geq 0 \text{ iff } \overline{\Gamma_N^*} \subseteq \{h \in \mathcal{H}_{\mathcal{N}} : f(h) \geq 0\}$$

$$\therefore \text{iff } \Gamma_N^* \subseteq \{h \in \mathcal{H}_{\mathcal{N}} : f(h) \geq 0\}$$

$$\therefore \Gamma_N^* \subset \overline{\Gamma_N^*}$$



Appendix: Inner and outer bounds for the entropic region.



Γ_N Shannon Outer bound (loose)

basic inequalities

$$I(X; Y) = H(X) + H(Y) - H(XY) \geq 0$$

$$I(X_A; X_B | X_C) \geq 0, \forall A, B, C \subseteq X$$

Half-space constraints

Γ_N^* Entropic Vectors Region

$\bar{\Gamma}_N^*$ Binary matroid Inner bound

for $N < 4$

Appendix: Groups and Group Actions,

- ✓ **Characterization of the General Linear Group**
- ✓ **Characterization of the Symmetric group**
- ✓ **Fixed points, stabilizer groups , orbits**
- ✓ **Left and Right group actions over a finite set**
 - Natural bijection between Orbits and Cosets of Stabilizers
 - Standard Quotient Theorem:
 - Lagrange Theorem
 - Orbit-Stabilizer Theorem
 - Proof Cauchy Frobenius Lemma

Appendix: Groups and Group Actions,

Set : $n \times n$ invertible matrices,

The general linear group of degree n through elementary matrices – the set

Operation: Ordinary matrix multiplication.

It is a group since:

- Product of two invertible matrices is again invertible,
- Inverse of an invertible matrix is invertible.
- Neutral element is the identity matrix.

$$\begin{bmatrix} a_1 & b_1 \\ c_1 & d_1 \end{bmatrix} \begin{bmatrix} a_2 & b_2 \\ c_2 & d_2 \end{bmatrix} = \begin{bmatrix} a_1 a_2 + b_1 c_2 & a_1 b_2 + b_1 d_2 \\ c_1 a_2 + d_1 c_2 & c_1 b_2 + d_1 d_2 \end{bmatrix}$$

$$\begin{bmatrix} a_1 & b_1 \\ c_1 & d_1 \end{bmatrix}^{-1} = \frac{1}{ad - bc} \begin{bmatrix} d_1 & -b_1 \\ -c_1 & a_1 \end{bmatrix} \quad \begin{bmatrix} a_2 & b_2 \\ c_2 & d_2 \end{bmatrix}^{-1} = \frac{1}{ad - bc} \begin{bmatrix} d_2 & -b_2 \\ -c_2 & a_2 \end{bmatrix}$$

$$\begin{bmatrix} a_1 a_2 + b_1 c_2 & a_1 b_2 + b_1 d_2 \\ c_1 a_2 + d_1 c_2 & c_1 b_2 + d_1 d_2 \end{bmatrix}^{-1} = \begin{bmatrix} a_1 & b_1 \\ c_1 & d_1 \end{bmatrix}^{-1} \begin{bmatrix} a_2 & b_2 \\ c_2 & d_2 \end{bmatrix}^{-1}$$

$$\begin{bmatrix} a_1 & b_1 \\ c_1 & d_1 \end{bmatrix} \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} = \begin{bmatrix} a_1 & b_1 \\ c_1 & d_1 \end{bmatrix} \quad \begin{bmatrix} a_1 & b_1 \\ c_1 & d_1 \end{bmatrix} \begin{bmatrix} a_1 & b_1 \\ c_1 & d_1 \end{bmatrix}^{-1} = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$$

Appendix: Groups and Group Actions,

The general linear group of degree n through elementary matrices – the binary operation

The elementary matrices generate the general linear group of invertible matrices.

Row switching

$$R_i \leftrightarrow R_j \quad T_{i,j} = \begin{bmatrix} 0 & 0 & 1 \\ 0 & 1 & 0 \\ 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} 0 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 & 1 \\ 1 & 0 & 0 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 1 \\ 0 & 0 & 1 & 0 & 1 \end{bmatrix}$$

Row multiplication

$$kR_i \rightarrow R_i, \quad k \neq 0 \quad T_i(m) = \begin{bmatrix} 1 & 0 & 0 \\ 0 & m & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 0 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 & 1 \\ 1 & 0 & 0 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 1 & 0 & 1 \\ 0 & m & 0 & m & m \\ 1 & 0 & 0 & 1 & 0 \end{bmatrix}$$

Row addition

$$R_i + kR_j \rightarrow R_i, \quad i \neq j \quad T_{i,j}(m) = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ m & 0 & 1 \end{bmatrix} \begin{bmatrix} 0 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 & 1 \\ 1 & 0 & 0 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 & 1 \\ 1 & 0 & m & 1 & m \end{bmatrix}$$

Left multiplication (pre-multiplication) by an elementary matrix represents elementary row operations, Right multiplication (post-multiplication) represents elementary column operations.

Appendix: Groups and Group Actions,

Permutations notations and fixed points

Permutations:

Rearranging members of a set into a particular sequence or order
Example,

Set $\{1,2,3\}$: $(1,2,3)$, $(1,3,2)$, $(2,1,3)$, $(2,3,1)$, $(3,1,2)$, and $(3,2,1)$.

The number of permutations of n distinct objects is $n!$

Cauchy's two-line notation:

$$\sigma_1 = \begin{pmatrix} 1 & 2 & 3 \\ 1 & 2 & 3 \end{pmatrix}; \sigma_2 = \begin{pmatrix} 1 & 2 & 3 \\ 1 & 3 & 2 \end{pmatrix}; \sigma_3 = \begin{pmatrix} 1 & 2 & 3 \\ 2 & 1 & 3 \end{pmatrix}; \sigma_4 = \begin{pmatrix} 1 & 2 & 3 \\ 2 & 3 & 1 \end{pmatrix}; \sigma_5 = \begin{pmatrix} 1 & 2 & 3 \\ 3 & 2 & 1 \end{pmatrix};$$

Cycle notation: permutation as a product of cycles
corresponding to the orbits of the permutation

$$\sigma_1 = (1)(2)(3); \sigma_2 = (1)(2 \ 3); \sigma_3 = (1 \ 2)(3); \sigma_4 = (1 \ 2 \ 3); \sigma_5 = (1 \ 3)(2)$$

An orbit of size 1 is called a fixed point of the permutation.

Appendix: Groups and Group Actions,

The subgroup of all
permutations for a given set

symmetric group of S , $\text{Sym}(S)$

Set: all permutations of any given set S ,

Operation : Composition of maps (product)

Neutral element: Identity function .

Example,

$(1,2,3), (1,2,3), (1,2,3), (1,2,3), (1,2,3), (1,2,3),$
 $\downarrow \quad \downarrow \quad \downarrow \quad \downarrow \quad \downarrow \quad \downarrow$
 $(1,2,3), (1,3,2), (2,1,3), (2,3,1), (3,1,2), (3,2,1).$

$(1,2,3)$



$(1,3,2)$



$(3,2,1)$

$(1,2,3)$



$(3,2,1)$

Appendix: Groups and Group Actions,

Left group action
over a finite set

Definition:

Left Group Action of Group G on Set X

a group G with binary operation(\cdot)

function $G \times X \rightarrow X$ s.t.

$\forall g \in G$ and $x \in X$,

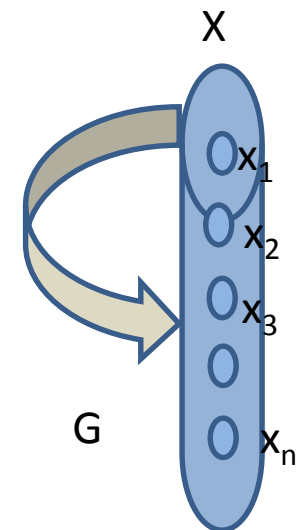
mapping $(g, x) \rightarrow g.x$ operation

satisfies properties:

(i) compatibility $(g \cdot h).x = g.(h.x) \quad \forall g, h \in G \text{ and } \forall x \in X.$

(ii) identity $\exists e, \text{ s.t. } e.x = x \quad \forall x \in X,$
 e neutral element of G .

X is left G - set.



Appendix: Groups and Group Actions,

Right group action over a finite set

Right Group Action of Group G on Set X

Definition:

a group G with binary operation (\cdot)

function $X \times G \rightarrow X$ s.t.,

$\forall g \in G$ and $x \in X$,

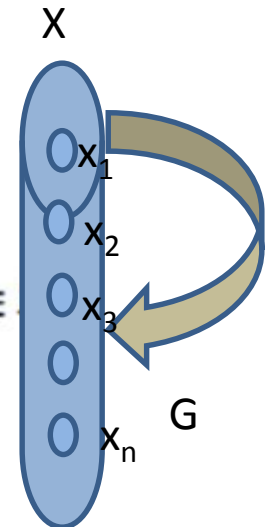
mapping $(x, g) \rightarrow x.g$, operation

satisfying axioms:

(i) compatibility: $x.(g.h) = (x.g).h = (x).g.h \quad \forall g, h \in G$ and $\forall x \in X$

(ii) identity: $x.e = x \quad \forall x \in X$

X is right G -set.



Appendix: Groups and Group Actions,

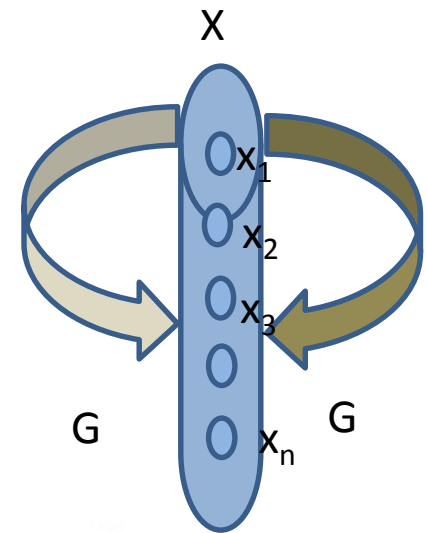
Equivalence in between Left group action and Right group action on a finite set

left group action \longleftrightarrow right group action

$$(g \star h)^{-1} = h^{-1} \star g^{-1}$$

$$\forall g, h \in G \text{ and } \forall x \in X.$$

$$\begin{aligned} \longrightarrow \text{left group action } (g \star h).x &= \\ (g \star h)^{-1} (g \star h).x.(g \star h) &= \\ (h^{-1} \star g^{-1} g \star h).x.(g \star h) &= \\ = x.(g \star h) \text{ right group action } &\longleftarrow \end{aligned}$$




Appendix: Groups and Group Actions,

- Characterization of the General Linear Group
- Characterization of the Symmetric group
- Fixed points, stabilizer groups , orbits
- Left and Right group actions over a finite set
- ✓ **Natural bijection between Orbits and Cosets of Stabilizers**
- ✓ **Standard Quotient Theorem:**
- ✓ **Lagrange Theorem**
- ✓ **Orbit-Stabilizer Theorem**
- ✓ **Proof Cauchy Frobenius Lemma**

Frobenius-Cauchy- Burnside Lemma

Stabilizers and Fixed points

orbits stabilizers.

$G(x) \subset X$  $G_x \leq G$

X_g fix points

Stabilizer of $x \in X$ is $G_x := \{g | gx = x\}$

$x \in X$ is fixed under Fixed point g in G iff $gx = x$.

The set of all fixed points of G is $X_g := \{x | gx = x\}$

The set of all fixed points of a subset S in G is $X_S := \{g \in S | gx = x\}$

If $S = G$ we call it Set of invariants.

we say x is a fixed point of g and
 g fixes x .

stabilizer subgroup of x (also called the isotropy)
is the set of all elements in G that fix x :

Appendix: Cauchy-Frobenius-Burnside Counting Theorem

Natural bijection between Orbits and Cosets of Stabilizers

For a fixed x in X , consider map G to X

$$g \rightarrow g.x \text{ for all } g \in G.$$

image of this map is the orbit of x



the coimage is the set of all left cosets of G_x .

The standard quotient theorem of set theory

gives a natural bijection between G/G_x and Gx

given by $hG_x \rightarrow h.x$.

orbit-stabilizer theorem.

If G and X are finite then the orbit-stabilizer theorem, together with Lagrange's theorem, gives $|Gx| = [G : G_x] = |G|/|G_x|$.

This result can be employed for counting arguments.

Standard Quotient Theorem:

The mapping $G(x) \rightarrow G/Gx : gx \rightarrow gG_x$ is a bijection ,

$$\begin{aligned}
 gx = g'x &\iff g^{-1}gx = g^{-1}g'x &\iff x = g^{-1}g'x \\
 &\iff g^{-1}g' \in G_x &\iff G_x = g^{-1}g'G_x &\iff g'G_x = gG_x
 \end{aligned}$$



Corollary: If G is a finite group acting on set X , then $x \in X$

$$|G(x)| = |G|/|G_x|$$

The standard quotient bijection in between orbits and cosets of the Stabilizer

Appendix: Cauchy-Frobenius-Burnside Counting Theorem

Lagrange Theorem:

Lagrange's Theorem *If G is a finite group and H is a subgroup of G ,
then $|H|$ divides $|G|$. number of distinct left cosets of H in G is $\frac{|G|}{|H|}$.*



$$|G| = r|H|.$$



$$|a_i H| = |H| \text{ for each } i,$$



$$|G| = |a_1 H| + |a_2 H| + \cdots + |a_r H|.$$



cosets are disjoint,

$$G = a_1 H \cup \cdots \cup a_r H.$$



$$a \text{ in } G, \quad aH = a_i H \text{ for some } i \quad a \in aH.$$



$$a_1 H, a_2 H, \dots, a_r H$$

distinct left cosets of H in G .

Orbit-Stabilizer Theorem

Corollary:

If G is a finite group acting on the set X , then for each $x \in X$

we have $|G(x)| = |G|/|G_x|$



$G(x)$ has the same number of elements as G / G_x

$$|G(x)| = [G : G_x]$$



$$g * x \mapsto g G_x$$



there is a well-defined bijection:

$$G(x) \rightarrow G / G_x$$



(Frobenius-Cauchy- Polya) from
standard quotient theorem to
Orbit Stabilizer theorem

Burnside Lemma

Standard Quotient Theorem

Appendix: Cauchy-Frobenius-Burnside Counting Theorem

Lemma (Cauchy-Frobenius):

The number of orbits of a finite group G acting on a finite set X is equal to the average number of fixed points:

$$|G| \sum_{t \in F} (1) = |G| \cdot |F|$$

$$|G \backslash X| = 1/|G| \sum_{g \in G} |X_g|$$



number of orbits of finite group G acting on a finite set X

$$\sum_{x \in G(t)} |G(x)|^{-1} = |G(x)| |G(x)|^{-1} = 1$$



$$GX := \{G(t) | t \in F\}$$



F is transversal

$$\sum_x |G| |G(x)|^{-1} = |G| \sum_x |G(x)|^{-1} = |G| \sum_{t \in F} \sum_{x \in G(t)} |G(x)|^{-1}$$

Proof Cauchy
Frobenius Lemma

Orbit-Stabilizer Theorem



Enumerating elements in the Stabilizer

$$\sum_x \sum_{g \in G_x} 1 = \sum_x |G_x| =$$



Enumerating fixed points in $G \times X$

$$\sum_{g \in G} |X_g| = |\{(g, x) \in G \times X | g.x = x\}| = \sum_{g \in G} \sum_{x \in X_g} 1$$

Appendix: Networks , Matroids, Non Shannon Inequalities

if $S(x) \neq \emptyset, \rightarrow |x| = k$ source dim

if $e_i \in \epsilon \rightarrow |e_i| = n$ edge cap

$\forall e(x,y), \exists f_e: (A^k)^\alpha \times (A^n)^\beta \rightarrow A^n$ $\alpha = |\mu_1, \mu_2, \dots, \mu_n|,$ Edge function
 $\beta = |e_{i1}, e_{i2}, \dots, e_{im}|$

$\forall x \in v, m \in R(x), \exists f_{x,m}: (A^k)^\alpha \times (A^n)^\beta \rightarrow A^k$ $\alpha = |\mu_1, \mu_2, \dots, \mu_n|,$ Decoding function
 $\beta = |e_{i1}, e_{i2}, \dots, e_{im}|$

$\forall A, (k,n) \text{ code} : \begin{cases} f_e \rightarrow e \in \epsilon \\ f_{x,m} \rightarrow x \in R(x) \end{cases}$ $a: \mu \rightarrow A^k$ message assignment
 $c: \epsilon \rightarrow A^n$ symbol vector

$$c(e) = f_e(a(x_1), \dots, a(x_\alpha), c(x_{\alpha+1}), \dots, c(x_{\alpha+\beta}))$$

$$\forall a, f_{x,m}(a(x_1), \dots, a(x_\alpha), c(x_{\alpha+1}), \dots, c(x_{\alpha+\beta})) = a(m)$$



x demand is satisfied,

(k,n) code is a (k,n) solution if every x demand is satisfied



Appendix: Networks , Matroids, Non Shannon Inequalities

(k,n) solution : over some alphabet, if every demand is satisfied $\rightarrow k/n$ is achievable coding rate .

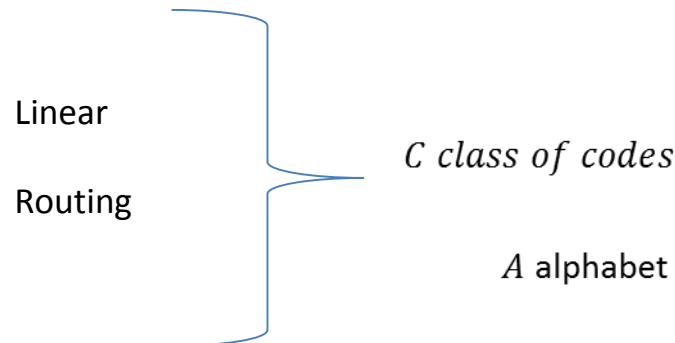
Solution of Networks

Solvable: if it has a (k,n) solution $k=n=1$.

Scalar linearly Solvable: if it has a linear (k,n) solution $k=n=1$.

Vector linearly Solvable: if it has a linear (k,n) solution $k=n$.

Coding capacity: $\sup \{ \frac{k}{n} : \exists (k,n) \text{ coding solution in } C \text{ over } A \}$



If $\exists (k,n) \text{ solution} \mid \frac{k}{n} = \text{Capacity}, \rightarrow \text{Achievable coding capacity}$

Appendix: Networks , Matroids, Non Shannon Inequalities

Codes of interest:

Linear: linear edge and decoding functions

Routing: simple copy - edge and decoding functions

Networks of interest:

Multicast: One source node, receiver catching all source messages

Multiple unicast: each message generated and demanded by just one source respectively

Network coding goal:

Achievable coding rate as large as possible

$$\sup \left\{ \frac{k}{n} : \exists (k, n) \text{ coding solution in } \mathcal{C} \text{ over } A \right\}$$

Network $\mathcal{N}(\mu, \nu, \epsilon)$

$$\epsilon = \epsilon_{in} \cup \epsilon_{out}$$

$$S: \nu \rightarrow 2^\mu$$

$$x \rightarrow S(x)$$

$$In(x) = S(x) \cup \epsilon_{in}$$

$$R: \nu \rightarrow 2^\mu$$

$$x \rightarrow R(x)$$

$$Out(x) = R(x) \cup \epsilon_{out}$$

$$\text{Input } (x) = [\mu_1, \mu_2, \dots, \mu_n; e_{i1}, e_{i2}, \dots, e_{im}]$$

Appendix : Characterization of entropy functions

Proposition 1: \forall subsets $\alpha, \beta, \gamma \subset N_n = \{1, \dots, n\}$, let $\Omega = \{X_i, i = 1, \dots, n\}$ be jointly distributed discrete random variables set $\rightarrow I(\alpha, \beta | \gamma) \geq 0$ (**Basic Inequalities**)



Joint entropies are maps $H_\Omega: 2^{N_n} \rightarrow [0, \infty)$

F_n is set of All maps $2^{N_n} \rightarrow [0, \infty)$

Def. $\Gamma_n = \{F \in F_n: F(\emptyset) = 0 : \alpha \subset \beta \rightarrow F(\alpha) \leq F(\beta); \forall \alpha, \beta \in 2^{N_n} F(\alpha) + F(\beta) \geq F(\alpha \cup \beta) + F(\alpha \cap \beta)\}$

Def. A function $F \in F_n$ is called constructible iff $\exists \Omega$, s.t. $H_\Omega = F$

Def. $\Gamma_n^* = \{F \in F_n: F \text{ is constructible}\}$

Def. A function $F \in F_n$ is called asymptotically constructible iff \exists sequence of sets Ω^k

$k=1, \dots, \exists H_{\Omega^k}$ s.t. $\lim_{k \rightarrow \infty} H_{\Omega^k} = F$

F is asymptotically constructible iff $F \in \overline{\Gamma_n^*}$

Appendix : Shannon Information inequalities

Information Identities

$$h(\alpha|\beta) = h(\alpha, \beta) - h(\beta)$$

$$I(\alpha; \beta) = h(\alpha) - h(\alpha|\beta)$$

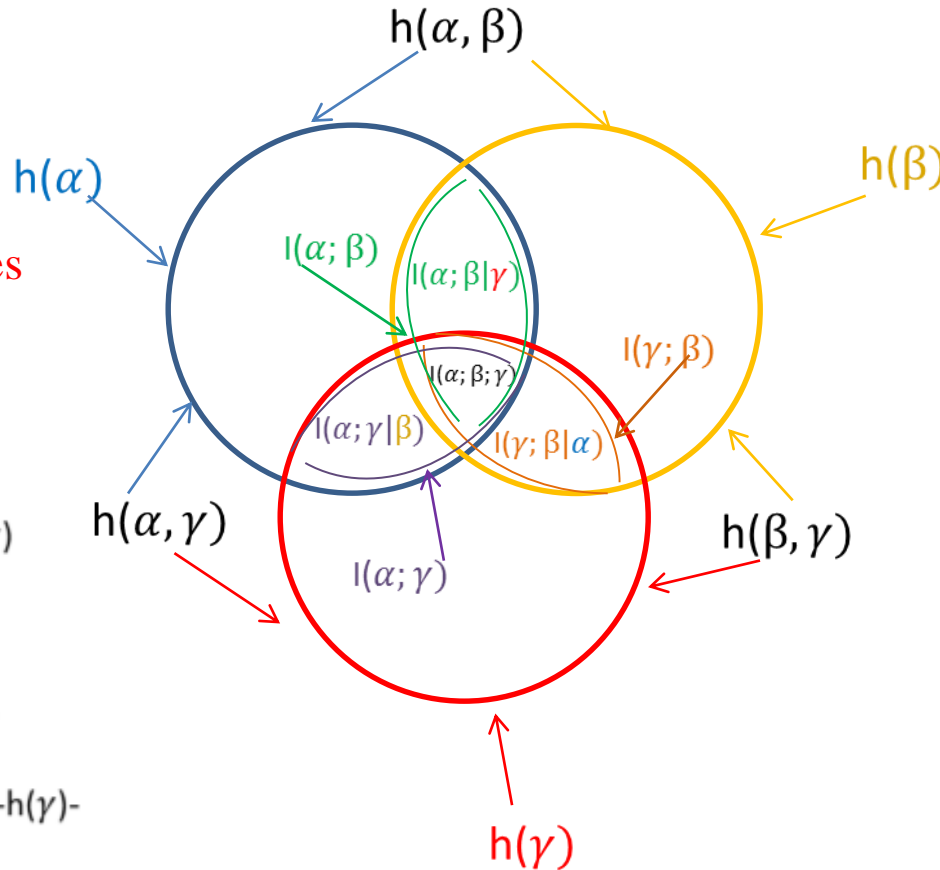
$$I(\alpha; \beta | \gamma) = h(\alpha|\beta) - h(\alpha|\beta, \gamma)$$

$$h(\emptyset) = 0$$

$$I(\alpha; \beta) = h(\alpha) + h(\beta) - h(\alpha, \beta)$$

$$I(\alpha; \beta | \gamma) = h(\alpha, \gamma) + h(\beta, \gamma) - h(\gamma) - h(\alpha, \beta, \gamma)$$

$$I(\alpha; \beta, \gamma) = I(\beta; \alpha | \gamma) + I(\alpha; \gamma)$$



$$h(\alpha) = h(\alpha|\emptyset) > 0$$

$$h(\alpha|\beta) > 0$$

$$I(\alpha|\beta) > 0$$

$$h(\alpha, \beta | \gamma) \leq h(\alpha | \gamma) - h(\beta | \gamma)$$

$$h(\alpha | \beta, \gamma) \leq h(\alpha | \gamma) \leq h(\alpha, \gamma | \beta)$$

Shannon Inequalities

- ✓ **Analytical approach for binary linear codes- Abstract Algebra – from Dr. Marcel Wild research.**

2nd step:

Averaging

Sym group fix points from
points fixed by a
canonical representative
of Conjugacy classes
Times size of the class.

- ✓ The Sym group Conjugacy classes Cardinality.
- ✓ Type of Permutation
- ✓ Partitions associated with cycle type
- ✓ Polya Cycle Index

$$b(n, \leq r) = \frac{\sum_{\lambda \in Part(n) 1 \leq \mu \leq k(r)} |C_\lambda| |D_\mu| \prod_{i=1}^n fix(\mu, i)^{a_i(\lambda)}}{|GL_r^2| |S_n|}$$

Appendix: Entropic vectors - analytic enumeration of binary linear codes

Burnside lemma expression
readapted for conjugacy classes
of matrices and permutations.

$$b(n, \leq r) = \frac{\sum_{(A, \pi) \in GL_r^2 \times S_n} |Z_{A, \pi}|}{|GL_r^2| |S_n|}$$



$$|H \wr_x G \backslash Y^x| = \frac{\sum_{(\psi, g) \in H \wr_x G} \prod_{v=1}^{c(g)} |Y_{h_v(\psi, g)}|}{|H^x| |G|}$$



$$b(n, \leq r) = \frac{\sum_{(A, \pi) \in GL_r^2 \times S_n} \prod_{i=1}^n |Y_{A_i}|^{a_i(\pi)}}{|GL_r^2| |S_n|}$$



$$b(n, \leq r) = \frac{\sum_{\lambda \in Part(n)} \sum_{1 \leq \mu \leq k(r)} |C_\lambda| |D_\mu| \prod_{i=1}^n fix(\mu, i)^{a_i(\lambda)}}{|GL_r^2| |S_n|}$$

Construction Enumeration Analytical method :

- ✓ **Group Theory approach for binary linear codes-
Abstract Algebra – from Dr. Marcel Wild research.**

4th step:

General Linear & Sym group
Acting Together
on the set of
binary linear codes.

- ✓ Polya Index and Vector index analogy
- ✓ Permutation & Automorphism number analogy.
- ✓ Symmetric Permutations and Linear transformations Analogy.

$$b(n, \leq r) = \frac{\sum_{\lambda \in Part(n) \atop 1 \leq \mu \leq k(r)} |C_\lambda| |D_\mu| \prod_{i=1}^n fix(\mu, i)^{a_i(\lambda)}}{|GL_r^2| |S_n|}$$

Type of Permutation characterize all possible Partitions induced By the sym Group over the Finite set.

$\pi\tau \in S_n$ are conjugate iff $a_i(\pi) = a_i(\tau)$ for all $1 \leq i \leq n$. A conjugation preserves cycle type, specifying a cycle type,



specifying a partition of n ,



specify a conjugacy class in S_n .

Conjugacy classes of $S_n \leftrightarrow$ number of partitions of n ,

The sequences $\lambda = (\lambda_1, \dots, \lambda_t)$, $\lambda_i \in \mathbb{N}$ s.t.

$\lambda_1 + \dots + \lambda_t = n$ and $\lambda_1 \geq \lambda_2 \geq \dots \lambda_t$.

If λ is a partition of n , $\therefore \lambda \vdash n$

Appendix: Entropic vectors - analytic enumeration of binary linear codes

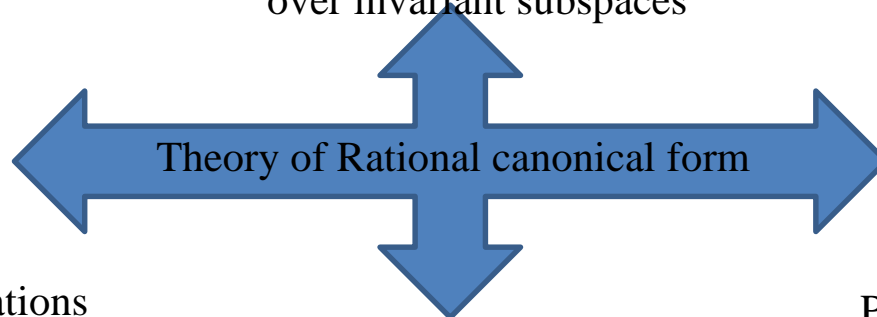
Analogy (Joseph Kung)

Permutation Cycle decomposition & Automorphisms decomposition

- ✓ Decomposition of Linear transformations into direct sum of Cyclic linear transformations
- ✓ Decomposition of Vector Space automorphisms into direct sum of Cyclic automorphisms over invariant subspaces

Permutation cycle decomposition

Linear transformation cycle decomposition



Partition induced by Permutations

Partition induced by Linear Automorphisms

Average of points
Fixed by both
sym and Linear groups

Type of Permutation
Permutation Cycle
Polya Index

Points
Fixed by canonical
representative
of the
sym group

Points
Fixed by canonical
representative
of the
Exponential Linear group

Type of Automorphism
Vector Space Cycle
Index

Construction Enumeration Analytical method Outline :

- ✓ Analytical approach for binary linear codes- Abstract Algebra – from Dr. Marcel Wild research.

2nd step:

Averaging

Sym group fix points from points fixed by a canonical representative of Conjugacy classes
Times size of the class.

- ✓ The Sym group Conjugacy classes Cardinality.
- ✓ Type of Permutation
- ✓ Partitions associated with cycle type
- ✓ Polya Cycle Index

$$b(n, \leq r) = \frac{\sum_{\lambda \in Part(n) \atop 1 \leq \mu \leq k(r)} |C_\lambda| |D_\mu| \prod_{i=1}^n fix(\mu, i)^{a_i(\lambda)}}{|GL_r^2| |S_n|}$$

The Size of a conjugacy class in the symmetric group

arrange 1 to 7 in any of $7!$

$$(a_1 a_2)(a_3 a_4)(a_5 a_6 a_7)$$

Notice $(a_1, a_2) = (a_2, a_1)$

$$(a_5 a_6 a_7) = (a_7 a_5 a_6) = (a_6 a_5 a_7)$$

each k -cycle over counted by a factor of k .

Notice $(a_1 a_4)(a_3, a_4) = (a_3 a_4)(a_1 a_2)$

over counted ways to arrange 2-cycles

we have

$$\frac{7!}{3 \cdot 2 \cdot 2 \cdot 2} = 210$$

cycle type permutations in S_7 .

cycle type c_1 1-cycles, c_2 2-cycles, \dots c_k k -cycles,

$$1c_1 + 2c_2 + \dots + kc_k = n.$$

in our example $c_1 = 0$, $c_2 = 2$, and $c_3 = 1$

The Size of a conjugacy class in the symmetric group

$n!$ possible ways to permute

but we need to **correct over counting**.

Therefore:

- ✓ Each of the c_j j -cycles can be rotated around j ways and be the same cycle,
 - ✓ so **divide by j^{c_j}**
 $j = 1, 2, \dots, k.$
- ✓ There are c_j j -cycles which *can be permuted around in $c_j!$* ways,
 - ✓ so **divide by $c_j!$**
 $j = 1, 2, \dots, k.$

The Size of a conjugacy class in the symmetric group

Number of permutations in
the conjugacy class described
by the c_i 's is

$$|C_\lambda| = \frac{n!}{\left(\prod_{i=1}^k i^{c_i} \prod_{i=1}^k c_i! \right)}$$

The denominator is often called z_λ
(for partitions of cycle type λ)

Construction Enumeration Analytical method Outline :

- ✓ **Analytical approach for binary linear codes- Abstract Algebra – from Dr. Marcel Wild research.**

2nd step:

Averaging

Sym group fix points from
points fixed by a
canonical representative
of Conjugacy classes
Times size of the class.

- ✓ The Sym group Conjugacy classes Cardinality.
- ✓ Type of Permutation
- ✓ Partitions associated with cycle type
- ✓ Polya Cycle Index

$$b(n, \leq r) = \frac{\sum_{\lambda \in Part(n) 1 \leq \mu \leq k(r)} |C_\lambda| |D_\mu| \prod_{i=1}^n fix(\mu, i)^{a_i(\lambda)}}{|GL_r^2| |S_n|}$$

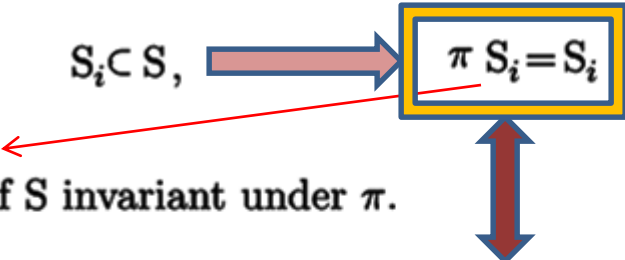
Decomposition of a Permutation to the direct sum of cyclic Permutations

(Type of a permutation)

let π be a permutation of finite set S

$$|S| = d$$

$$\pi = \sigma_1 \cdot \sigma_2 \cdot \dots \cdot \sigma_n, \quad \sigma_i \cap \sigma_j = \emptyset,$$

$$S = S_1 \cup S_2 \cup \dots \cup S_n, \quad S_i \subset S, \quad \pi S_i = S_i$$


S_i is the minimal subset of S invariant under π .

type of the permutation $a(\pi) = (a_1(\pi), \dots, a_i(\pi), \dots, a_d(\pi))$

$a_i(\pi)$ is the number of cycles of length i in the cycle decomposition.

Appendix: Entropic vectors - analytic enumeration of binary linear codes

Points Fixed by a representative of Permutations group Conjugacy Classes

$\pi\tau \in S_n$ are conjugate iff $a_i(\pi) = a_i(\tau)$ for all $1 \leq i \leq n$.

The conjugacy classes of S_n  partitions of n ,

sequences $\lambda = (\lambda_1, \dots, \lambda_t)$ of natural numbers

satisfying

$$\lambda_1 + \dots + \lambda_t = n \quad \lambda_1 \geq \lambda_2 \geq \dots \lambda_t.$$

λ is a partition of n $\lambda \vdash n$

set of all partitions of n is: $Part(n) := \{\lambda \mid \lambda \vdash n\}$

$\lambda_j = i$ is denoted as $a_i(\lambda)$

λ parametrize the conjugacy classes C_λ of the group S_n .

the cycle Index for permutations

Introducing the Polya cycle Index

Expressing Permutations of a Group as a Polynomial

let G is a permutation group on S ,

the permutation cycle index,

also called Polya cycle index,

$$Z(G; x) = \frac{\sum_{\alpha \in G} \prod_{i,b} x_{i,b}^{a_{i,b}(\alpha)}}{|G|}$$

$Z(G; x)$ is the generating function **of** permutations in G ,

Construction Enumeration Analytical method Outline :

- ✓ **Analytical approach for binary linear codes- Abstract Algebra – from Dr. Marcel Wild research.**

3th step:

General Linear group fix points

From points fixed by a
**canonical representative
of Conjugacy classes**

Times

Size of the class.

- ✓ Conjugacy classes of the $GL_n(r)$
- ✓ Conjugacy classes Cardinality of General Linear Group
- ✓ Type of Automorphisms.
- ✓ The vector space cycle index

$$b(n, \leq r) = \frac{\sum_{\lambda \in Part(n)} \sum_{1 \leq \mu \leq k(r)} |C_\lambda| |D_\mu| \prod_{i=1}^n fix(\mu, i)^{a_i(\lambda)}}{|GL_r^2| |S_n|}$$

Appendix: Entropic vectors - analytic enumeration of binary linear codes

elements of H^X group partitioned in conjugacy classes;

$$H^x = \{ \psi: (h_1, h_2, h_3, \dots, h_x) \mid h_i \in H \}$$

ψ and ψ' of H are conjugate if

$$\psi_i \text{ in } H^X \text{ with } \psi_i \psi' \psi_i^{-1} = \psi$$

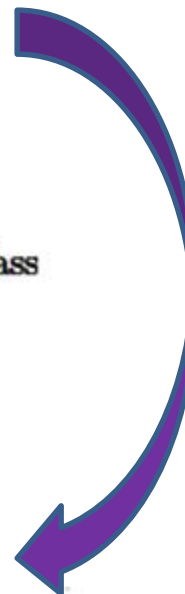
conjugacy is equivalence relation

partitions H^X into equivalence classes.

every ψ in H^X belongs to one conjugacy class

$$Cl(\psi') = Cl(\psi) \iff \psi', \psi \text{ are conjugate,}$$

$$Cl(\psi) = \{ \psi_i \psi \psi_i^{-1} : \psi_i \in H^x \}$$



Appendix: Entropic vectors - analytic enumeration of binary linear codes

The Polya cycle index

Enumeration objects classes under permutation group action.

The vector space cycle index

counting objects classes under linear group action .

LEMMA 2. (Joseph Kung 1981)

Let p be a monic irreducible polynomial in R of degree m ,
and $b=(b_1, b_2, \dots)$ a partition of j .

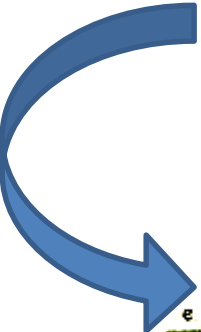
Define the numbers d_i by

$$d_i = b_1 i + b_2 2i + \dots + b_i i + b_{i+1} i + \dots + b_i i.$$

Then $c_p(b)$, the number of invertible matrices commuting with the block diagonal matrix $D(p, b)$, is given by

$$c_p(b) = \prod_i \prod_{k=1}^{b_i} (q^{m d_i} - q^{m(d_i - k)}).$$

In particular, $c_p(b)$ depends only on the degree of p .



$$h(u, \epsilon) := \prod_{i=1}^e \prod_{k=1}^{\beta_i} (2^{m \delta_i} - 2^{m(\delta_i - k)})$$



$$|D\mu| = |D(p; \epsilon_1, \dots, \epsilon_s)| = \frac{|GL_r^2|}{h(p_1, \epsilon_1) \cdots h(p_s, \epsilon_s)}$$

Appendix: Entropic vectors - analytic enumeration of binary linear codes

Type of Automorphism

Automorphism α

$\alpha \longleftrightarrow$ array $a(\alpha)$ its Type,

Entries indexed by (i, b) ,

$i \rightarrow$ positive integer,

$b \rightarrow$ sequence of nonnegative integers

finitely many nonzero terms.

$a_{i,b}(\alpha) \rightarrow$ number of subspaces U

in the primary decomposition of α of order $p(z)^i$,

$p(z)^i$ is irreducible

α restricted to U having species b .

$a(\alpha)$ has finitely

many nonzero entries.

$$a(\alpha) = \begin{pmatrix} a_{i_1, b_1}(\alpha) \cdots & a_{i_1, b_j}(\alpha) & a_{i_1, b_n}(\alpha) \\ \vdots & \cdots & \vdots \\ & \cdots & \\ a_{i_m, b_1}(\alpha) \cdots & a_{i_m, b_j}(\alpha) & a_{i_m, b_n}(\alpha) \end{pmatrix}$$

The type of automorphism needed to complete the expression for number of points fixed by a canonical automorphism using the vector space cycle index.

Decomposition of an Automorphism in to the direct sum of cyclic automorphisms

Definition: (Vector space cycle index)

Let H be a finite linear group acting on the vector space V :

a finite subgroup of $GL(V)$ of all automorphisms of V .

$x_{i,b}$, $i \rightarrow$ positive integer
 $b \rightarrow$ a sequence of nonnegative integers
 with finitely many nonzero terms.

The Vector space cycle index is :

$$Z(H; x) = \frac{\sum_{\alpha \in G} \prod_{i,b} |x_{i,b}|^{a_{i,b}(\alpha)}}{|H|}.$$

, where $\prod_{i,b} |x_{i,b}|^{a_{i,b}(\alpha)}$ is

weight of the automorphism.

The vector space cycle index and the weight of automorphisms used to count the points fixed by the canonical automorphism of linear vector space.