

Entropy functions, information inequalities, and polymatroids

František Matúš

Institute of Information Theory and Automation
Academy of Sciences of the Czech Republic
E-mail: matus@utia.cas.cz

Applications of Matroid Theory and Combinatorial Optimization

Banff, August 6, 2009

$\xi = (\xi_i)_{i \in N}$... a random vector indexed by a finite set N

$\xi = (\xi_i)_{i \in N}$... a random vector indexed by a finite set N

$\xi_I = (\xi_i)_{i \in I}$... a subvector of ξ , $I \subseteq N$

$\xi = (\xi_i)_{i \in N}$... a random vector indexed by a finite set N

$\xi_I = (\xi_i)_{i \in I}$... a subvector of ξ , $I \subseteq N$

The **entropy function** h_ξ of ξ maps each subset I of N to the Shannon entropy of ξ_I .

$\xi = (\xi_i)_{i \in N}$... a random vector indexed by a finite set N

$\xi_I = (\xi_i)_{i \in I}$... a subvector of ξ , $I \subseteq N$

The **entropy function** h_ξ of ξ maps each subset I of N to the Shannon entropy of ξ_I .

$(h_\xi(I))_{I \subseteq N}$... an **entropic** point of Euclidean space $\mathbb{R}^{\mathcal{P}(N)}$,
provided ξ takes a finite number of values

$\xi = (\xi_i)_{i \in N}$... a random vector indexed by a finite set N

$\xi_I = (\xi_i)_{i \in I}$... a subvector of ξ , $I \subseteq N$

The **entropy function** h_ξ of ξ maps each subset I of N to the Shannon entropy of ξ_I .

$(h_\xi(I))_{I \subseteq N}$... an **entropic** point of Euclidean space $\mathbb{R}^{\mathcal{P}(N)}$,
provided ξ takes a finite number of values

H_N^{ent} ... the set of entropic points

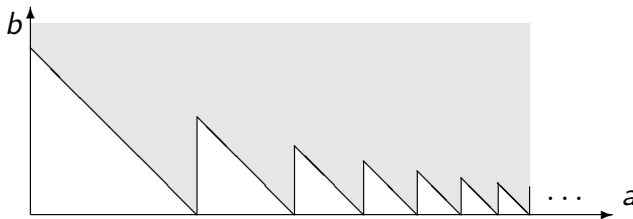
H_N^{ent} ... a sophisticated set, unknown if $|N| \geq 3$

H_N^{ent} ... a sophisticated set, unknown if $|N| \geq 3$

... a supporting hyperplane may intersect H_N^{ent} in the set

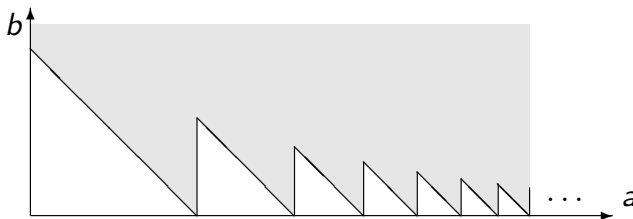
H_N^{ent} ... a sophisticated set, unknown if $|N| \geq 3$

... a supporting hyperplane may intersect H_N^{ent} in the set



H_N^{ent} ... a sophisticated set, unknown if $|N| \geq 3$

... a supporting hyperplane may intersect H_N^{ent} in the set



$$a + b \geq \ln \lceil e^a \rceil$$

(FM, Jan 2006, *Trans. IT IE³*)

$cl(H_N^{\text{ent}})$... the closure of H_N^{ent}

$cl(H_N^{\text{ent}})$... the closure of H_N^{ent}
consists of **almost entropic** points

$cl(H_N^{\text{ent}})$... the closure of H_N^{ent}
consists of **almost entropic** points

$cl(H_N^{\text{ent}})$ is a convex cone (Zhang & Yeung, Nov 1997, *Trans. IT IE³*)

$cl(H_N^{\text{ent}})$... the closure of H_N^{ent}
consists of **almost entropic** points

$cl(H_N^{\text{ent}})$ is a convex cone (Zhang & Yeung, Nov 1997, *Trans. IT IE³*)

... not depending on the base of logarithms in $-\sum_x p(x) \ln p(x)$

$cl(H_N^{\text{ent}})$... the closure of H_N^{ent}
consists of **almost entropic** points

$cl(H_N^{\text{ent}})$ is a convex cone (Zhang & Yeung, Nov 1997, *Trans. IT IE³*)

... not depending on the base of logarithms in $-\sum_x p(x) \ln p(x)$

$ri(cl(H_N^{\text{ent}})) \subseteq H_N^{\text{ent}}$ (FM, Jan 07, *Trans. IT IE³*)

$cl(H_N^{\text{ent}})$... the closure of H_N^{ent}
consists of **almost entropic** points

$cl(H_N^{\text{ent}})$ is a convex cone (Zhang & Yeung, Nov 1997, *Trans. IT IE³*)

... not depending on the base of logarithms in $-\sum_x p(x) \ln p(x)$

$ri(cl(H_N^{\text{ent}})) \subseteq H_N^{\text{ent}}$ (FM, Jan 07, *Trans. IT IE³*)

... H_N^{ent} and $cl(H_N^{\text{ent}})$ differ only on the boundary of the cone

(N, g) ... **polymatroid**, sits on the ground set N and has

(N, g) ... **polymatroid**, sits on the ground set N and has
a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

(N, g) ... **polymatroid**, sits on the ground set N and has
a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying
 $g(\emptyset) = 0$

(N, g) ... **polymatroid**, sits on the ground set N and has
a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

(N, g) ... **polymatroid**, sits on the ground set N and has a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

$$g(I) + g(J) \geq g(I \cup J) + g(I \cap J) \text{ for } I, J \subseteq N.$$

(N, g) ... **polymatroid**, sits on the ground set N and has a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

$$g(I) + g(J) \geq g(I \cup J) + g(I \cap J) \text{ for } I, J \subseteq N.$$

It is a **matroid** if $g(I) \in \mathbb{Z}$ and $g(I) \leq |I|$ for $I \subseteq N$.

(N, g) ... **polymatroid**, sits on the ground set N and has a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

$$g(I) + g(J) \geq g(I \cup J) + g(I \cap J) \text{ for } I, J \subseteq N.$$

It is a **matroid** if $g(I) \in \mathbb{Z}$ and $g(I) \leq |I|$ for $I \subseteq N$.

$H_N \subseteq \mathbb{R}^{\mathcal{P}(N)}$... the rank functions sitting on N form

(N, g) ... **polymatroid**, sits on the ground set N and has
 a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

$$g(I) + g(J) \geq g(I \cup J) + g(I \cap J) \text{ for } I, J \subseteq N.$$

It is a **matroid** if $g(I) \in \mathbb{Z}$ and $g(I) \leq |I|$ for $I \subseteq N$.

$H_N \subseteq \mathbb{R}^{\mathcal{P}(N)}$... the rank functions sitting on N form
 a polyhedral cone (finite intersection of closed halfspaces).

(N, g) ... **polymatroid**, sits on the ground set N and has a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

$$g(I) + g(J) \geq g(I \cup J) + g(I \cap J) \text{ for } I, J \subseteq N.$$

It is a **matroid** if $g(I) \in \mathbb{Z}$ and $g(I) \leq |I|$ for $I \subseteq N$.

$H_N \subseteq \mathbb{R}^{\mathcal{P}(N)}$... the rank functions sitting on N form a polyhedral cone (finite intersection of closed halfspaces).

(N, h_ξ) is a polymatroid if $h_\xi \in \mathbb{R}^{\mathcal{P}(N)}$ (Fujishige, 1978, *Inf. Contr.*)

(N, g) ... **polymatroid**, sits on the ground set N and has a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

$$g(I) + g(J) \geq g(I \cup J) + g(I \cap J) \text{ for } I, J \subseteq N.$$

It is a **matroid** if $g(I) \in \mathbb{Z}$ and $g(I) \leq |I|$ for $I \subseteq N$.

$H_N \subseteq \mathbb{R}^{\mathcal{P}(N)}$... the rank functions sitting on N form a polyhedral cone (finite intersection of closed halfspaces).

(N, h_ξ) is a polymatroid if $h_\xi \in \mathbb{R}^{\mathcal{P}(N)}$ (Fujishige, 1978, *Inf. Contr.*)

... a polymatroid (N, g) is (a)ent if g is an (a)ent point

(N, g) ... **polymatroid**, sits on the ground set N and has
 a rank function $g: \mathcal{P}(N) \rightarrow [0, +\infty)$ satisfying

$$g(\emptyset) = 0$$

$$g(I) \leq g(J) \text{ for } I \subseteq J$$

$$g(I) + g(J) \geq g(I \cup J) + g(I \cap J) \text{ for } I, J \subseteq N.$$

It is a **matroid** if $g(I) \in \mathbb{Z}$ and $g(I) \leq |I|$ for $I \subseteq N$.

$H_N \subseteq \mathbb{R}^{\mathcal{P}(N)}$... the rank functions sitting on N form
 a polyhedral cone (finite intersection of closed halfspaces).

(N, h_ξ) is a polymatroid if $h_\xi \in \mathbb{R}^{\mathcal{P}(N)}$ (Fujishige, 1978, *Inf. Contr.*)

... a polymatroid (N, g) is (a)ent if g is an (a)ent point

$$H_N \supseteq \text{cl}(H_N^{\text{ent}}) \supseteq H_N^{\text{ent}} \supseteq \text{ri}(\text{cl}(H_N^{\text{ent}}))$$

For $J \subseteq N$ and the matroid (N, r_J) with $r_J(I) = \begin{cases} 1, & I \cap J \neq \emptyset \\ 0, & I \cap J = \emptyset \end{cases}$

For $J \subseteq N$ and the matroid (N, r_J) with $r_J(I) = \begin{cases} 1, & I \cap J \neq \emptyset \\ 0, & I \cap J = \emptyset \end{cases}$

$t r_J$ is entropic for all $t \geq 0$.

For $J \subseteq N$ and the matroid (N, r_J) with $r_J(I) = \begin{cases} 1, & I \cap J \neq \emptyset \\ 0, & I \cap J = \emptyset \end{cases}$

$t r_J$ is entropic for all $t \geq 0$.

If N partitions into $I \cup J$ and $r(N) = r(I) + r(J)$ in a matroid (N, r)

For $J \subseteq N$ and the matroid (N, r_J) with $r_J(I) = \begin{cases} 1, & I \cap J \neq \emptyset \\ 0, & I \cap J = \emptyset \end{cases}$

$t r_J$ is entropic for all $t \geq 0$.

If N partitions into $I \cup J$ and $r(N) = r(I) + r(J)$ in a matroid (N, r)
 then $t r \in H_N^{\text{ent}}$ iff $t r|_{\mathcal{P}(I)} \in H_I^{\text{ent}}$ and $t r|_{\mathcal{P}(J)} \in H_J^{\text{ent}}$.

For $J \subseteq N$ and the matroid (N, r_J) with $r_J(I) = \begin{cases} 1, & I \cap J \neq \emptyset \\ 0, & I \cap J = \emptyset \end{cases}$

$t r_J$ is entropic for all $t \geq 0$.

If N partitions into $I \cup J$ and $r(N) = r(I) + r(J)$ in a matroid (N, r)
 then $t r \in H_N^{\text{ent}}$ iff $t r|_{\mathcal{P}(I)} \in H_I^{\text{ent}}$ and $t r|_{\mathcal{P}(J)} \in H_J^{\text{ent}}$.

If a matroid (N, r) is connected

For $J \subseteq N$ and the matroid (N, r_J) with $r_J(I) = \begin{cases} 1, & I \cap J \neq \emptyset \\ 0, & I \cap J = \emptyset \end{cases}$

$t r_J$ is entropic for all $t \geq 0$.

If N partitions into $I \cup J$ and $r(N) = r(I) + r(J)$ in a matroid (N, r)
 then $t r \in H_N^{\text{ent}}$ iff $t r|_{\mathcal{P}(I)} \in H_I^{\text{ent}}$ and $t r|_{\mathcal{P}(J)} \in H_J^{\text{ent}}$.

If a matroid (N, r) is connected

then r belongs to an extreme ray of H_N .

From now on, a matroid (N, r) is connected and $r(N) \geq 2$.

From now on, a matroid (N, r) is connected and $r(N) \geq 2$.

For (N, r) , $t \geq 0$ and random vector $\xi = (\xi_i)_{i \in N}$,
 $tr \in H_N^{\text{ent}}$ implies $t \in \{\ln d : d = 1, 2, \dots\}$, and
 $(\ln d)r = h_\xi$ implies that ξ_I takes $d^{r(I)}$ values
with the same probability, $I \subseteq N$. (FM, 1994, *Int. J. Gen. Syst.*)

From now on, a matroid (N, r) is connected and $r(N) \geq 2$.

For (N, r) , $t \geq 0$ and random vector $\xi = (\xi_i)_{i \in N}$,
 $t r \in H_N^{\text{ent}}$ implies $t \in \{\ln d : d = 1, 2, \dots\}$, and
 $(\ln d) r = h_\xi$ implies that ξ_I takes $d^{r(I)}$ values
with the same probability, $I \subseteq N$. (FM, 1994, *Int. J. Gen. Syst.*)

A matroid (N, r) is **partition (p-) representable of the degree $d \geq 2$**
if there exist partitions π_i , $i \in N$, of a finite set Ω
with $d^{r(N)}$ elements such that for all $I \subseteq N$ the meet
of π_i , $i \in I$, has $d^{r(I)}$ blocks of the same cardinality.

From now on, a matroid (N, r) is connected and $r(N) \geq 2$.

For (N, r) , $t \geq 0$ and random vector $\xi = (\xi_i)_{i \in N}$,
 $tr \in H_N^{\text{ent}}$ implies $t \in \{\ln d : d = 1, 2, \dots\}$, and
 $(\ln d)r = h_\xi$ implies that ξ_I takes $d^{r(I)}$ values
with the same probability, $I \subseteq N$. (FM, 1994, *Int. J. Gen. Syst.*)

A matroid (N, r) is **partition (p-) representable of the degree $d \geq 2$**
if there exist partitions π_i , $i \in N$, of a finite set Ω
with $d^{r(N)}$ elements such that for all $I \subseteq N$ the meet
of π_i , $i \in I$, has $d^{r(I)}$ blocks of the same cardinality.

... secret sharing matroids, almost affine codes, ...

$|\Omega| = 3^2 = d^{r(N)}$, $|N| = 4$, the four partitions

$|\Omega| = 3^2 = d^{r(N)}$, $|N| = 4$, the four partitions



$|\Omega| = 3^2 = d^{r(N)}$, $|N| = 4$, the four partitions



represent $U_{2,4}$, the degree is $d = 3$.

$|\Omega| = 3^2 = d^{r(N)}$, $|N| = 4$, the four partitions



represent $U_{2,4}$, the degree is $d = 3$.

They correspond to two orthogonal Latin squares.

$|\Omega| = 3^2 = d^{r(N)}$, $|N| = 4$, the four partitions



represent $U_{2,4}$, the degree is $d = 3$.

They correspond to two orthogonal Latin squares.

A p -representation of $U_{2,4}$ of the degree $d = 10$ exists.

If (N, r) is linear over the field with d elements

If (N, r) is linear over the field with d elements
then it is p -representable of the degree d .

If (N, r) is linear over the field with d elements
then it is p -representable of the degree d .
The converse holds when $d = 2$ or $d = 3$.

If (N, r) is linear over the field with d elements
then it is p -representable of the degree d .

The converse holds when $d = 2$ or $d = 3$.

The non-Pappus matroid is p -representable of the degree 9.

If (N, r) is linear over the field with d elements
then it is p -representable of the degree d .

The converse holds when $d = 2$ or $d = 3$.

The non-Pappus matroid is p -representable of the degree 9.

(is multilinear, Simonis & Ashikhmin, 1998, *Des. Codes and Cryptography*)

If (N, r) is linear over the field with d elements
then it is p -representable of the degree d .

The converse holds when $d = 2$ or $d = 3$.

The non-Pappus matroid is p -representable of the degree 9.

(is multilinear, Simonis & Ashikhmin, 1998, *Des. Codes and Cryptography*)

P -representable of some degree implies almost entropic.

If (N, r) is linear over the field with d elements
then it is p -representable of the degree d .

The converse holds when $d = 2$ or $d = 3$.

The non-Pappus matroid is p -representable of the degree 9.

(is multilinear, Simonis & Ashikhmin, 1998, *Des. Codes and Cryptography*)

P -representable of some degree implies almost entropic.

Stick the Fano and non-Fano matroids along a point:

If (N, r) is linear over the field with d elements
then it is p -representable of the degree d .

The converse holds when $d = 2$ or $d = 3$.

The non-Pappus matroid is p -representable of the degree 9.

(is multilinear, Simonis & Ashikhmin, 1998, *Des. Codes and Cryptography*)

P -representable of some degree implies almost entropic.

Stick the Fano and non-Fano matroids along a point:

not p -representable of any degree, but almost entropic.

Entropy functions and polymatroids

Matroids and Shannon entropy

Convolutions and expansions

Information inequalities

Multiples of matroidal rank functions

Partition representable matroids

Classes of matroids

Open problems

Open problems

Open problems

? p -representable of some degree but not multilinear ?

Open problems

- ? p -representable of some degree but not multilinear ?
- ? the class of almost entropic matroids, excluded minors ?

Open problems

- ? p -representable of some degree but not multilinear ?
- ? the class of almost entropic matroids, excluded minors ?
- ? the critical problem for these classes of matroids ?

Convolution $(N, g * f)$ of polymatroids (N, g) and (N, f) , given by

Convolution $(N, g * f)$ of polymatroids (N, g) and (N, f) , given by
$$g * f(I) = \min_{J \subseteq I} [g(J) + f(I \setminus J)] \text{ for } I \subseteq N,$$

Convolution $(N, g * f)$ of polymatroids (N, g) and (N, f) , given by
$$g * f(I) = \min_{J \subseteq I} [g(J) + f(I \setminus J)] \text{ for } I \subseteq N,$$

is a polymatroid whenever f is modular (Lovász, 1982)

Convolution $(N, g * f)$ of polymatroids (N, g) and (N, f) , given by

$$g * f (I) = \min_{J \subseteq I} [g(J) + f(I \setminus J)] \text{ for } I \subseteq N,$$

is a polymatroid whenever f is modular (Lovász, 1982)

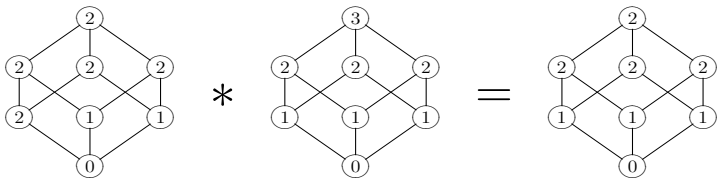
$$[f(I) = \sum_{i \in I} f(i) \text{ for } I \subseteq N].$$

Convolution $(N, g * f)$ of polymatroids (N, g) and (N, f) , given by

$$g * f(I) = \min_{J \subseteq I} [g(J) + f(I \setminus J)] \text{ for } I \subseteq N,$$

is a polymatroid whenever f is modular (Lovász, 1982)

$$[f(I) = \sum_{i \in I} f(i) \text{ for } I \subseteq N].$$

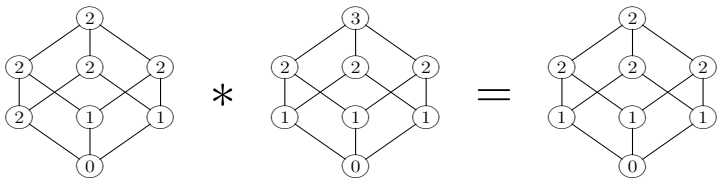


Convolution $(N, g * f)$ of polymatroids (N, g) and (N, f) , given by

$$g * f(I) = \min_{J \subseteq I} [g(J) + f(I \setminus J)] \text{ for } I \subseteq N,$$

is a polymatroid whenever f is modular (Lovász, 1982)

$$[f(I) = \sum_{i \in I} f(i) \text{ for } I \subseteq N].$$



g aent and f modular implies $g * f$ aent.

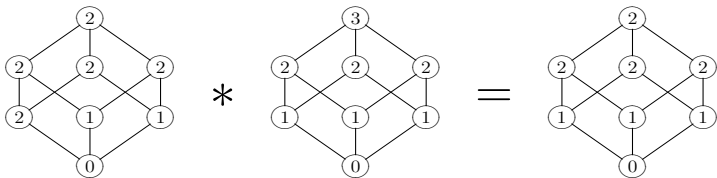
(FM07)

Convolution $(N, g * f)$ of polymatroids (N, g) and (N, f) , given by

$$g * f(I) = \min_{J \subseteq I} [g(J) + f(I \setminus J)] \text{ for } I \subseteq N,$$

is a polymatroid whenever f is modular (Lovász, 1982)

$$[f(I) = \sum_{i \in I} f(i) \text{ for } I \subseteq N].$$



g aent and f modular implies $g * f$ aent.

(FM07)

$[cl(H_N^{\text{ent}})]$ is closed to the convolutions with modular polymatroids.]

Factor of a polymatroid (N, g)

Factor of a polymatroid (N, g)
by a set M of disjoint blocks covering N

Factor of a polymatroid (N, g)

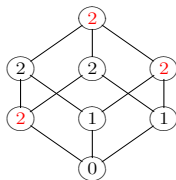
by a set M of disjoint blocks covering N

is the polymatroid (M, f) given by $f(L) = g(\cup L)$ for $L \subseteq M$.

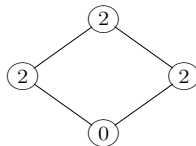
Factor of a polymatroid (N, g)

by a set M of disjoint blocks covering N

is the polymatroid (M, f) given by $f(L) = g(\cup L)$ for $L \subseteq M$.



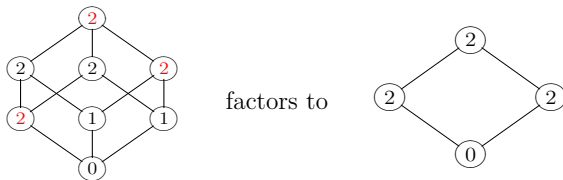
factors to



Factor of a polymatroid (N, g)

by a set M of disjoint blocks covering N

is the polymatroid (M, f) given by $f(L) = g(\cup L)$ for $L \subseteq M$.

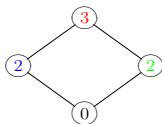


Every integer polymatroid is a factor of a matroid.

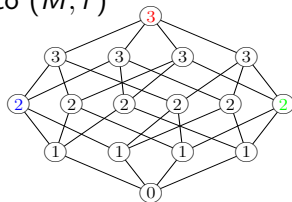
Expansion of an integer polymatroid (M, f)

Expansion of an integer polymatroid (M, f)
is a matroid (N, r) that factors back to (M, f)

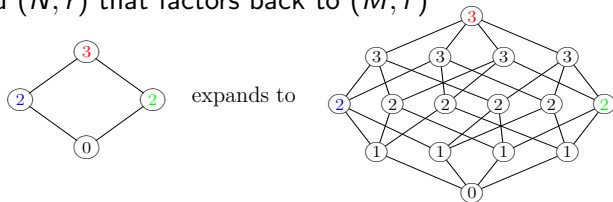
Expansion of an integer polymatroid (M, f)
 is a matroid (N, r) that factors back to (M, f)



expands to

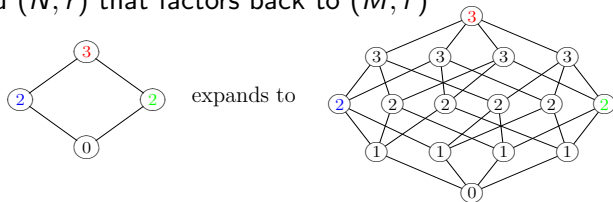


Expansion of an integer polymatroid (M, f)
 is a matroid (N, r) that factors back to (M, f)



Free expansion can be constructed in two steps

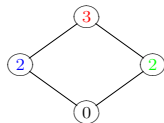
Expansion of an integer polymatroid (M, f)
 is a matroid (N, r) that factors back to (M, f)



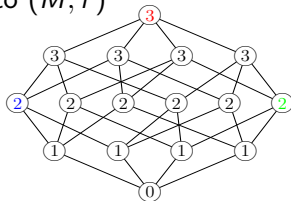
Free expansion can be constructed in two steps

1. make $f(m)$ parallel copies of each $m \in M$

Expansion of an integer polymatroid (M, f)
 is a matroid (N, r) that factors back to (M, f)

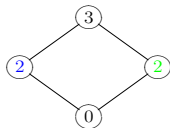


expands to

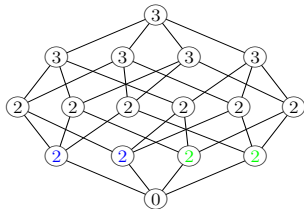


Free expansion can be constructed in two steps

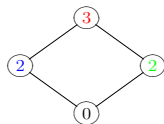
1. make $f(m)$ parallel copies of each $m \in M$



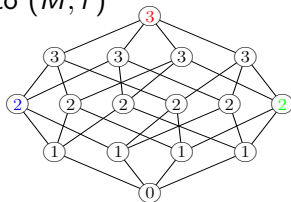
parallelizes to



Expansion of an integer polymatroid (M, f)
 is a matroid (N, r) that factors back to (M, f)

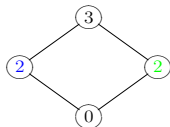


expands to

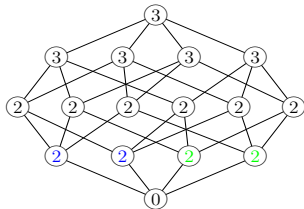


Free expansion can be constructed in two steps

1. make $f(m)$ parallel copies of each $m \in M$



parallelizes to



2. convolve with the free matroid $I \mapsto |I|$

Every ant integer polymatroid (M, f)
is a factor of an ant matroid.

(FM, Jan 2007, *Trans. IT IE³*)

Every aent integer polymatroid (M, f)
is a factor of an aent matroid.

(FM, Jan 2007, *Trans. IT IE³*)

The cone $cl(H_N^{\text{ent}})$ can be described in terms of aent matroids:

Every aent integer polymatroid (M, f)
is a factor of an aent matroid.

(FM, Jan 2007, *Trans. IT IE³*)

The cone $cl(H_N^{\text{ent}})$ can be described in terms of aent matroids:
scalings of factors of aent matroids are dense $cl(H_N^{\text{ent}})$.

A point $c = (c_I)_{I \subseteq N}$ of $\mathbb{R}^{\mathcal{P}(N)}$ generates
a (linear unconditional) **information inequality** if
 $\sum_{I \subseteq N} c_I \cdot g(I) \leq 0$ for the entropic points $g = (g(I))_{I \subseteq N}$.

A point $c = (c_I)_{I \subseteq N}$ of $\mathbb{R}^{\mathcal{P}(N)}$ generates
a (linear unconditional) **information inequality** if
$$\sum_{I \subseteq N} c_I \cdot g(I) \leq 0$$
 for the entropic points $g = (g(I))_{I \subseteq N}$.

... $\langle c, g \rangle \leq 0$ for $g \in H_N^{\text{ent}}$, thus c belongs to the polar of H_N^{ent} .

A point $c = (c_I)_{I \subseteq N}$ of $\mathbb{R}^{\mathcal{P}(N)}$ generates
a (linear unconditional) **information inequality** if
 $\sum_{I \subseteq N} c_I \cdot g(I) \leq 0$ for the entropic points $g = (g(I))_{I \subseteq N}$.

... $\langle c, g \rangle \leq 0$ for $g \in H_N^{\text{ent}}$, thus c belongs to the polar of H_N^{ent} .

$$\text{pol}(H_N) \subseteq \text{pol}(\text{cl}(H_N^{\text{ent}})) = \text{pol}(H_N^{\text{ent}})$$

A point $c = (c_I)_{I \subseteq N}$ of $\mathbb{R}^{\mathcal{P}(N)}$ generates
a (linear unconditional) **information inequality** if
$$\sum_{I \subseteq N} c_I \cdot g(I) \leq 0$$
 for the entropic points $g = (g(I))_{I \subseteq N}$.

... $\langle c, g \rangle \leq 0$ for $g \in H_N^{\text{ent}}$, thus c belongs to the polar of H_N^{ent} .

$$\text{pol}(H_N) \subseteq \text{pol}(\text{cl}(H_N^{\text{ent}})) = \text{pol}(H_N^{\text{ent}})$$

The inequality is of **Shannon type** if it is satisfied even
by the rank functions of all polymatroids, thus if $c \in \text{pol}(H_N)$.

A point $c = (c_I)_{I \subseteq N}$ of $\mathbb{R}^{\mathcal{P}(N)}$ generates
a (linear unconditional) **information inequality** if
$$\sum_{I \subseteq N} c_I \cdot g(I) \leq 0$$
 for the entropic points $g = (g(I))_{I \subseteq N}$.

... $\langle c, g \rangle \leq 0$ for $g \in H_N^{\text{ent}}$, thus c belongs to the polar of H_N^{ent} .

$$\text{pol}(H_N) \subseteq \text{pol}(\text{cl}(H_N^{\text{ent}})) = \text{pol}(H_N^{\text{ent}})$$

The inequality is of **Shannon type** if it is satisfied even
by the rank functions of all polymatroids, thus if $c \in \text{pol}(H_N)$.

If $|N| \leq 3$ then $H_N = \text{cl}(H_N^{\text{ent}})$
whence all info inequalities are of Shannon type.

For the entropy functions $g = h_\xi$ over $N = \{i, j, k, l\}$

$$3[g(ik) + g(il) + g(kl)] + g(jk) + g(jl) \\ \geq g(i) + 2[g(k) + g(l)] + g(ij) + 4g(ikl) + g(jkl)$$

(Zhang & Yeung 1998, *Trans. IT IE³*)

i, j, k, l considered for singletons, the signs for union omitted

For the entropy functions $g = h_\xi$ over $N = \{i, j, k, l\}$

$$3[g(ik) + g(il) + g(kl)] + g(jk) + g(jl) \\ \geq g(i) + 2[g(k) + g(l)] + g(ij) + 4g(ikl) + g(jkl)$$

(Zhang & Yeung 1998, *Trans. IT IE³*)

i, j, k, l considered for singletons, the signs for union omitted

ZY inequality is violated by the polymatroid

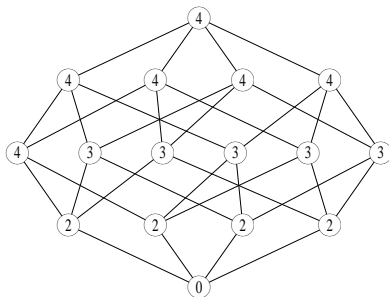
For the entropy functions $g = h_\xi$ over $N = \{i, j, k, l\}$

$$3[g(ik) + g(il) + g(kl)] + g(jk) + g(jl) \\ \geq g(i) + 2[g(k) + g(l)] + g(ij) + 4g(ikl) + g(jkl)$$

(Zhang & Yeung 1998, *Trans. IT IE³*)

i, j, k, l considered for singletons, the signs for union omitted

ZY inequality is violated by the polymatroid



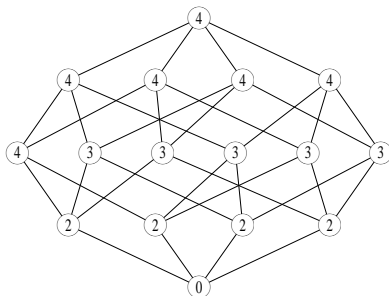
For the entropy functions $g = h_\xi$ over $N = \{i, j, k, l\}$

$$3[g(ik) + g(il) + g(kl)] + g(jk) + g(jl) \\ \geq g(i) + 2[g(k) + g(l)] + g(ij) + 4g(ikl) + g(jkl)$$

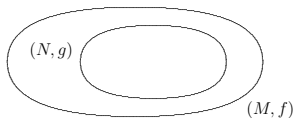
(Zhang & Yeung 1998, *Trans. IT IE³*)

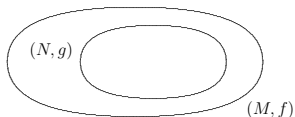
i, j, k, l considered for singletons, the signs for union omitted

ZY inequality is violated by the polymatroid

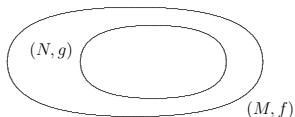


hence it is not of Shannon type and $cl(H_N^{\text{ent}}) \subsetneq H_N$.

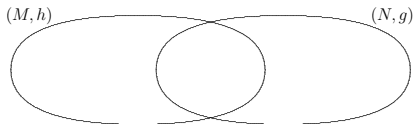


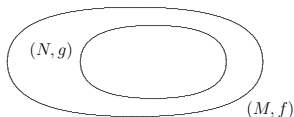


If $N \subseteq M$ and $g(I) = f(I)$ for $I \subseteq N$ then
 g is the *restriction* of f and f is an *extension* of g .

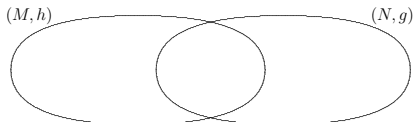


If $N \subseteq M$ and $g(I) = f(I)$ for $I \subseteq N$ then
 g is the *restriction* of f and f is an *extension* of g .

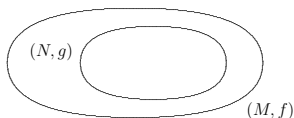




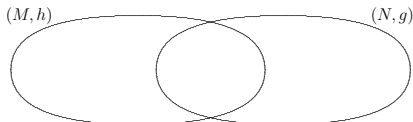
If $N \subseteq M$ and $g(I) = f(I)$ for $I \subseteq N$ then
 g is the *restriction* of f and f is an *extension* of g .



Polymatroids g and h are **adhesive** if
a polymatroid $(M \cup N, f)$ extends both and
$$f(M) + f(N) = f(M \cup N) + f(M \cap N)$$



If $N \subseteq M$ and $g(I) = f(I)$ for $I \subseteq N$ then
 g is the *restriction* of f and f is an *extension* of g .



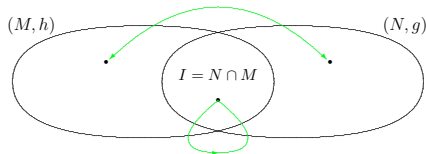
Polymatroids g and h are **adhesive** if
a polymatroid $(M \cup N, f)$ extends both and

$$f(M) + f(N) = f(M \cup N) + f(M \cap N)$$

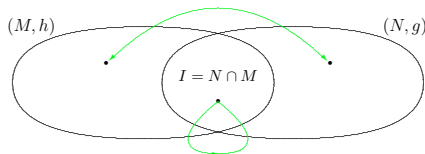
(f ... an **adhesive extension** of g and h).

A polymatroid (N, g) is **selfadhesive at** $I \subseteq N$
if (N, g) and its *copy* (M, h) *along* I adhere.

A polymatroid (N, g) is **selfadhesive at** $I \subseteq N$
if (N, g) and its *copy* (M, h) *along* I adhere.

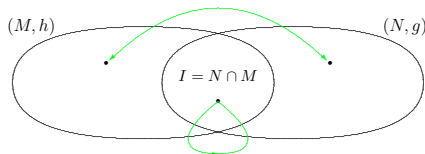


A polymatroid (N, g) is **selfadhesive at** $I \subseteq N$
if (N, g) and its *copy* (M, h) *along* I adhere.



A polymatroid is **selfadhesive**
if it is selfadhesive at each subset of its ground set.

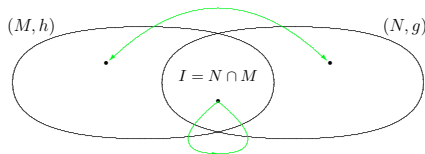
A polymatroid (N, g) is **selfadhesive at** $I \subseteq N$
if (N, g) and its *copy* (M, h) *along* I adhere.



A polymatroid is **selfadhesive**
if it is selfadhesive at each subset of its ground set.

Over the ground set N of cardinality four, a polymatroid is selfadhesive if and only if it satisfies all instances of ZY inequality.

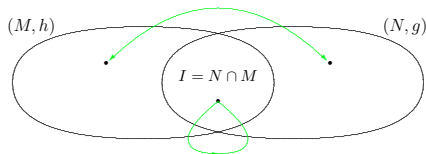
A polymatroid (N, g) is **selfadhesive at** $I \subseteq N$
 if (N, g) and its *copy* (M, h) *along* I adhere.



A polymatroid is **selfadhesive**
 if it is selfadhesive at each subset of its ground set.

Over the ground set N of cardinality four, a polymatroid is selfadhesive if and only if it satisfies all instances of ZY inequality.

A polymatroid (N, g) is **selfadhesive at** $I \subseteq N$
 if (N, g) and its *copy* (M, h) *along* I adhere.



A polymatroid is **selfadhesive**
 if it is selfadhesive at each subset of its ground set.

Over the ground set N of cardinality four, a polymatroid is selfadhesive if and only if it satisfies all instances of ZY inequality.

(FM 2007, *Discrete Math*)

The entropy functions are selfadhesive.

Iterate adhesive extensions and restrictions:

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by
 $g \in H_N^{\text{ar}}(s+1)$ iff $g \in H_N$ and

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by

$g \in H_N^{\text{ar}}(s+1)$ iff $g \in H_N$ and

the restrictions of g to any $I, J \subseteq N$ with $I \cup J = N$

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by
 $g \in H_N^{\text{ar}}(s+1)$ iff $g \in H_N$ and
the restrictions of g to any $I, J \subseteq N$ with $I \cup J = N$
have an adhesive extension in $H_N^{\text{ar}}(s)$.

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by

$g \in H_N^{\text{ar}}(s+1)$ iff $g \in H_N$ and

the restrictions of g to any $I, J \subseteq N$ with $I \cup J = N$

have an adhesive extension in $H_N^{\text{ar}}(s)$.

$H_N^{\text{ar}}(s) \supseteq H_N^{\text{ar}}(s+1) \dots$ polyhedral cones

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by

$g \in H_N^{\text{ar}}(s+1)$ iff $g \in H_N$ and

the restrictions of g to any $I, J \subseteq N$ with $I \cup J = N$

have an adhesive extension in $H_N^{\text{ar}}(s)$.

$H_N^{\text{ar}}(s) \supseteq H_N^{\text{ar}}(s+1) \dots$ polyhedral cones

$H_N^{\text{ia}} = \bigcap_{s \geq 0} H_N^{\text{ar}}(s) \dots$ the polymatroids with **inner adhesivity**.

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by

$g \in H_N^{\text{ar}}(s+1)$ iff $g \in H_N$ and

the restrictions of g to any $I, J \subseteq N$ with $I \cup J = N$

have an adhesive extension in $H_N^{\text{ar}}(s)$.

$H_N^{\text{ar}}(s) \supseteq H_N^{\text{ar}}(s+1) \dots$ polyhedral cones

$H_N^{\text{ia}} = \bigcap_{s \geq 0} H_N^{\text{ar}}(s) \dots$ the polymatroids with **inner adhesivity**.

$$\text{cl}(H_N^{\text{ent}}) \subseteq H_N^{\text{ia}}$$

Iterate adhesive extensions and restrictions:

a sequence $H_N^{\text{ar}}(s)$, $s \geq 0$, starting at $H_N^{\text{ar}}(0) = H_N$ is defined by

$g \in H_N^{\text{ar}}(s+1)$ iff $g \in H_N$ and

the restrictions of g to any $I, J \subseteq N$ with $I \cup J = N$

have an adhesive extension in $H_N^{\text{ar}}(s)$.

$H_N^{\text{ar}}(s) \supseteq H_N^{\text{ar}}(s+1) \dots$ polyhedral cones

$H_N^{\text{ia}} = \bigcap_{s \geq 0} H_N^{\text{ar}}(s) \dots$ the polymatroids with **inner adhesivity**.

$$\text{cl}(H_N^{\text{ent}}) \subseteq H_N^{\text{ia}}$$

... because two restrictions of an entropic polymatroid have
 an adhesive extension that is entropic.

For $N = \{1, 2, 3, 4, 5\}$ and $g \in H_N^{\text{ar}}(s)$, $s \geq 1$,

$$s[\square_{12,34} g + \Delta_{34|5} g + \Delta_{45|3} g] \\ + \Delta_{35|4} g + \frac{s(s-1)}{2} [\Delta_{24|3} g + \Delta_{34|2} g] \geq 0.$$

For $N = \{1, 2, 3, 4, 5\}$ and $g \in H_N^{\text{ar}}(s)$, $s \geq 1$,

$$s \left[\square_{12,34} g + \Delta_{34|5} g + \Delta_{45|3} g \right] \\ + \Delta_{35|4} g + \frac{s(s-1)}{2} \left[\Delta_{24|3} g + \Delta_{34|2} g \right] \geq 0.$$

where $\Delta_{34|5} g = g(35) + g(45) - g(5) - g(345)$

For $N = \{1, 2, 3, 4, 5\}$ and $g \in H_N^{\text{ar}}(s)$, $s \geq 1$,

$$s \left[\square_{12,34} g + \Delta_{34|5} g + \Delta_{45|3} g \right] \\
+ \Delta_{35|4} g + \frac{s(s-1)}{2} \left[\Delta_{24|3} g + \Delta_{34|2} g \right] \geq 0.$$

where $\Delta_{34|5} g = g(35) + g(45) - g(5) - g(345)$

and $\square_{12,34} g = \Delta_{34|1} g + \Delta_{34|2} g + \Delta_{12|\emptyset} g - \Delta_{34|\emptyset} g$

For $N = \{1, 2, 3, 4, 5\}$ and $g \in H_N^{\text{ar}}(s)$, $s \geq 1$,

$$s \left[\square_{12,34} g + \Delta_{34|5} g + \Delta_{45|3} g \right] \\
+ \Delta_{35|4} g + \frac{s(s-1)}{2} \left[\Delta_{24|3} g + \Delta_{34|2} g \right] \geq 0.$$

where $\Delta_{34|5} g = g(35) + g(45) - g(5) - g(345)$

and $\square_{12,34} g = \Delta_{34|1} g + \Delta_{34|2} g + \Delta_{12|\emptyset} g - \Delta_{34|\emptyset} g$

A proof is by induction on s , proving even
 three sequences of such inequalities simultaneously.

For $N = \{1, 2, 3, 4, 5\}$ and $g \in H_N^{\text{ar}}(s)$, $s \geq 1$,

$$s \left[\square_{12,34} g + \Delta_{34|5} g + \Delta_{45|3} g \right] \\
+ \Delta_{35|4} g + \frac{s(s-1)}{2} \left[\Delta_{24|3} g + \Delta_{34|2} g \right] \geq 0.$$

where $\Delta_{34|5} g = g(35) + g(45) - g(5) - g(345)$

and $\square_{12,34} g = \Delta_{34|1} g + \Delta_{34|2} g + \Delta_{12|\emptyset} g - \Delta_{34|\emptyset} g$

A proof is by induction on s , proving even
 three sequences of such inequalities simultaneously.

Hence, all the inequalities hold for the almost entropic points.

$$(\xi_5 = \xi_1)$$

$$(\xi_5 = \xi_1)$$

For $s \geq 1$ and the entropic function f of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$s \square_{12,34} f + \Delta_{24,34} f + \frac{s(s+1)}{2} [\Delta_{23,34} f + \Delta_{23,24} f] \geq 0$$

$$(\xi_5 = \xi_1)$$

For $s \geq 1$ and the entropic function f of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$s \square_{12,34} f + \Delta_{24,34} f + \frac{s(s+1)}{2} [\Delta_{23,34} f + \Delta_{23,24} f] \geq 0$$

In terms of mutual information,

$$\begin{aligned} & s [I(\xi_3; \xi_4 | \xi_1) + I(\xi_3; \xi_4 | \xi_2) + I(\xi_1; \xi_2) - I(\xi_3; \xi_4)] \\ & + I(\xi_2; \xi_3 | \xi_4) + \frac{s(s+1)}{2} [I(\xi_2; \xi_4 | \xi_3) + I(\xi_3; \xi_4 | \xi_2)] \geq 0 \end{aligned}$$

$$(\xi_5 = \xi_1)$$

For $s \geq 1$ and the entropic function f of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$s \square_{12,34} f + \Delta_{24,34} f + \frac{s(s+1)}{2} [\Delta_{23,34} f + \Delta_{23,24} f] \geq 0$$

In terms of mutual information,

$$\begin{aligned} & s [I(\xi_3; \xi_4 | \xi_1) + I(\xi_3; \xi_4 | \xi_2) + I(\xi_1; \xi_2) - I(\xi_3; \xi_4)] \\ & + I(\xi_2; \xi_3 | \xi_4) + \frac{s(s+1)}{2} [I(\xi_2; \xi_4 | \xi_3) + I(\xi_3; \xi_4 | \xi_2)] \geq 0 \end{aligned}$$

$s = 1$: ZY inequality.

$$(\xi_5 = \xi_1)$$

For $s \geq 1$ and the entropic function f of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$s \square_{12,34} f + \Delta_{24,34} f + \frac{s(s+1)}{2} [\Delta_{23,34} f + \Delta_{23,24} f] \geq 0$$

In terms of mutual information,

$$\begin{aligned} & s [I(\xi_3; \xi_4 | \xi_1) + I(\xi_3; \xi_4 | \xi_2) + I(\xi_1; \xi_2) - I(\xi_3; \xi_4)] \\ & + I(\xi_2; \xi_3 | \xi_4) + \frac{s(s+1)}{2} [I(\xi_2; \xi_4 | \xi_3) + I(\xi_3; \xi_4 | \xi_2)] \geq 0 \end{aligned}$$

$s = 1$: ZY inequality.

$$s = 2: \quad 2 \square_{12,34} f + \Delta_{24,34} f + 3 \Delta_{23,34} f + 3 \Delta_{23,24} f \geq 0$$

$$(\xi_5 = \xi_1)$$

For $s \geq 1$ and the entropic function f of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$s \square_{12,34} f + \Delta_{24,34} f + \frac{s(s+1)}{2} [\Delta_{23,34} f + \Delta_{23,24} f] \geq 0$$

In terms of mutual information,

$$\begin{aligned} & s [I(\xi_3; \xi_4 | \xi_1) + I(\xi_3; \xi_4 | \xi_2) + I(\xi_1; \xi_2) - I(\xi_3; \xi_4)] \\ & + I(\xi_2; \xi_3 | \xi_4) + \frac{s(s+1)}{2} [I(\xi_2; \xi_4 | \xi_3) + I(\xi_3; \xi_4 | \xi_2)] \geq 0 \end{aligned}$$

$s = 1$: ZY inequality.

$$s = 2: \quad 2 \square_{12,34} f + \Delta_{24,34} f + 3 \Delta_{23,34} f + 3 \Delta_{23,24} f \geq 0$$

(Dougherty, Freiling & Zeger, *ISIT 2006*)

$cl(H_N^{\text{ent}})$ is not polyhedral if and only if $|N| \geq 4$.

$cl(H_N^{\text{ent}})$ is not polyhedral if and only if $|N| \geq 4$.

(FM, *ISIT 2007*)

$cl(H_N^{\text{ent}})$ is not polyhedral if and only if $|N| \geq 4$.

(FM, *ISIT 2007*)

For a proof it suffices to consider $|N| = 4$.

$cl(H_N^{\text{ent}})$ is not polyhedral if and only if $|N| \geq 4$.

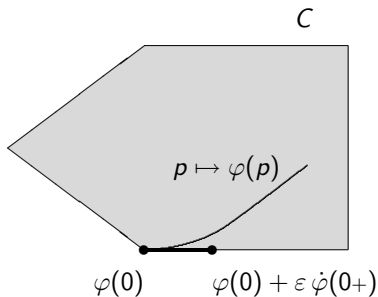
(FM, *ISIT 2007*)

For a proof it suffices to consider $|N| = 4$.

The latter sequence of inequalities is used to arrive at contradiction with a geometrical lemma.

If $C \subseteq \mathbb{R}^d$ is polyhedral and a curve $\varphi: [0, 1] \rightarrow C$ has a tangent $\dot{\varphi}(0_+)$ then C contains the segment with endpoints $\varphi(0)$ and $\varphi(0) + \varepsilon \dot{\varphi}(0_+)$ for some $\varepsilon > 0$.

If $C \subseteq \mathbb{R}^d$ is polyhedral and a curve $\varphi: [0, 1] \rightarrow C$ has a tangent $\dot{\varphi}(0_+)$ then C contains the segment with endpoints $\varphi(0)$ and $\varphi(0) + \varepsilon \dot{\varphi}(0_+)$ for some $\varepsilon > 0$.



An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
from four $\{0, 1\}$ -valued variables:

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
from four $\{0, 1\}$ -valued variables:

$\xi_1 = 0$ with the probability $2p$

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
from four $\{0, 1\}$ -valued variables:

$\xi_1 = 0$ with the probability $2p$

$\xi_2 = 0$ with the probability $\frac{1}{2}$

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
from four $\{0, 1\}$ -valued variables:

$\xi_1 = 0$ with the probability $2p$

$\xi_2 = 0$ with the probability $\frac{1}{2}$

ξ_1 independent of ξ_2

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
from four $\{0, 1\}$ -valued variables:

$\xi_1 = 0$ with the probability $2p$

$\xi_2 = 0$ with the probability $\frac{1}{2}$

ξ_1 independent of ξ_2

$\xi_3 = \xi_1 \cdot \xi_2$

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
from four $\{0, 1\}$ -valued variables:

$$\xi_1 = 0 \text{ with the probability } 2p$$

$$\xi_2 = 0 \text{ with the probability } \frac{1}{2}$$

ξ_1 independent of ξ_2

$$\xi_3 = \xi_1 \cdot \xi_2$$

$$\xi_4 = (1 - \xi_1)(1 - \xi_2).$$

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
from four $\{0, 1\}$ -valued variables:

$$\xi_1 = 0 \text{ with the probability } 2p$$

$$\xi_2 = 0 \text{ with the probability } \frac{1}{2}$$

ξ_1 independent of ξ_2

$$\xi_3 = \xi_1 \cdot \xi_2$$

$$\xi_4 = (1 - \xi_1)(1 - \xi_2).$$

$h_{\xi}^{(p)}$... the entropy function of $(\xi_1, \xi_2, \xi_3, \xi_4)$

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
 from four $\{0, 1\}$ -valued variables:

$$\xi_1 = 0 \text{ with the probability } 2p$$

$$\xi_2 = 0 \text{ with the probability } \frac{1}{2}$$

ξ_1 independent of ξ_2

$$\xi_3 = \xi_1 \cdot \xi_2$$

$$\xi_4 = (1 - \xi_1)(1 - \xi_2).$$

$h_\xi^{(p)}$... the entropy function of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$\ln 2 \cdot \varphi(p) = h_\xi^{(p)} + \beta(p) r_1^{14} + [\ln 2 + 2p \ln 2 - \frac{1}{2}\beta(2p)] [r_1^{23} + r_2^4]$$

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
 from four $\{0, 1\}$ -valued variables:

$$\xi_1 = 0 \text{ with the probability } 2p$$

$$\xi_2 = 0 \text{ with the probability } \frac{1}{2}$$

ξ_1 independent of ξ_2

$$\xi_3 = \xi_1 \cdot \xi_2$$

$$\xi_4 = (1 - \xi_1)(1 - \xi_2).$$

$h_\xi^{(p)}$... the entropy function of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$\ln 2 \cdot \varphi(p) = h_\xi^{(p)} + \beta(p) r_1^{14} + [\ln 2 + 2p \ln 2 - \frac{1}{2}\beta(2p)] [r_1^{23} + r_2^4]$$

$$\text{where } \beta(p) = -p \ln p - (1 - p) \ln(1 - p)$$

An appropriate curve in $cl(H_N^{\text{ent}})$ is constructed
 from four $\{0, 1\}$ -valued variables:

$\xi_1 = 0$ with the probability $2p$

$\xi_2 = 0$ with the probability $\frac{1}{2}$

ξ_1 independent of ξ_2

$\xi_3 = \xi_1 \cdot \xi_2$

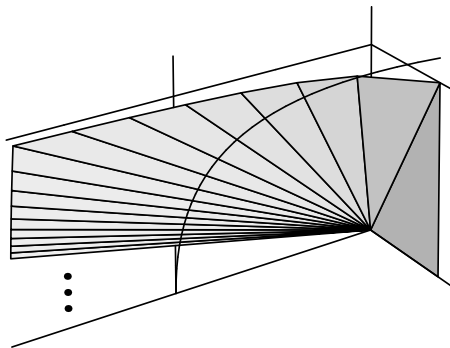
$\xi_4 = (1 - \xi_1)(1 - \xi_2)$.

$h_\xi^{(p)}$... the entropy function of $(\xi_1, \xi_2, \xi_3, \xi_4)$

$$\ln 2 \cdot \varphi(p) = h_\xi^{(p)} + \beta(p) r_1^{14} + [\ln 2 + 2p \ln 2 - \frac{1}{2}\beta(2p)] [r_1^{23} + r_2^4]$$

where $\beta(p) = -p \ln p - (1 - p) \ln(1 - p)$

and r_1^{14} , r_1^{23} , r_2^4 are linear matroids.



A projection to \mathbb{R}^3 of the halfspaces given by the new information inequalities and the curve $p \mapsto \varphi(p)$.

Added after the discussion: **Classes of matroids**

Added after the discussion: **Classes of matroids**

