

Entropy and matroids

František Matúš

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

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collect basic properties of the ranks of all A_I submatrices

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crossroad of combinatorics, algebra and finite geometry

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for $K \subseteq N$ all $I \subseteq K$ maximal in \mathcal{I} have the same cardinality.

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many theorems on one-to-one correspondences

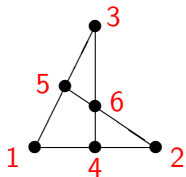
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$r(I)$... affine dimension of I

B base ... three points not collinear

C circuit ... $\{1, 2, 4\}$, $\{1, 4, 5, 6\}$, etc.

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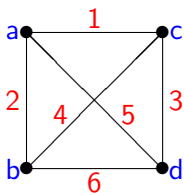
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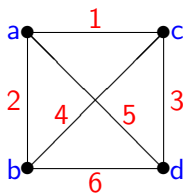


B base ... edges of a spanning tree
 C circuit ... edges of a minimal cycle

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matroids ... vertexless graphs

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look at the entropy $H(\xi_I)$

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$H(\xi_\emptyset)$	$H(\xi_1)$	$H(\xi_2)$	$H(\xi_3)$	$H(\xi_1, \xi_2)$	$H(\xi_1, \xi_3)$	$H(\xi_2, \xi_3)$	$H(\xi_1, \xi_2, \xi_3)$
0	$\ln 2$	$\ln 2$	$\ln 2$	$\ln 4$	$\ln 4$	$\ln 4$	$\ln 4$

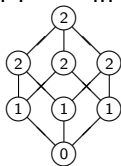
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matroidal rank function



multiplied by $\ln 2$

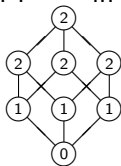
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Theorem

If ξ_1, \dots, ξ_n are distributed uniformly on the linear code generated by a matrix A over \mathbb{F} then $H(\xi_I) = \text{rank}(A_I) \ln |\mathbb{F}|$, $I \subseteq N$.

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connections to entropy: Fujishige 1978, Pippenger 1986

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Nguyen: a necessary and sufficient condition for an integer polymatroid to be on an extreme ray of H_N

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an analogous theorem identifying matroids in the network coding?

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the minimum is called the **distance** of P from model

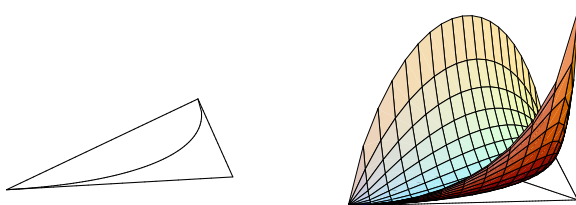
N. Ay 2002

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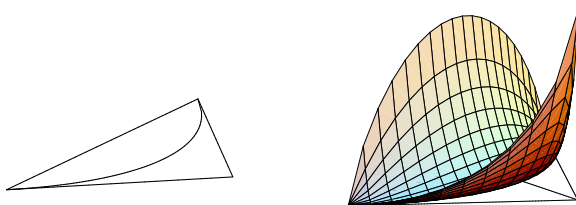
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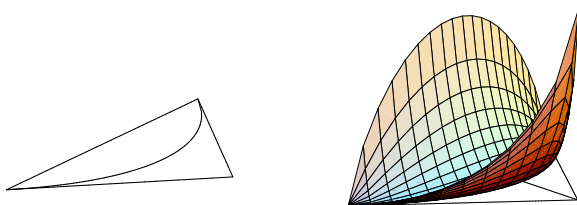
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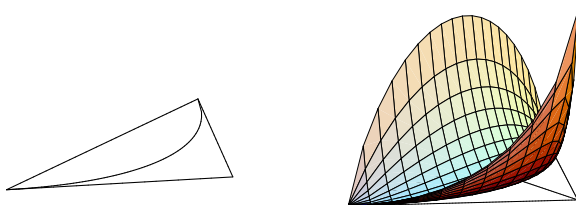
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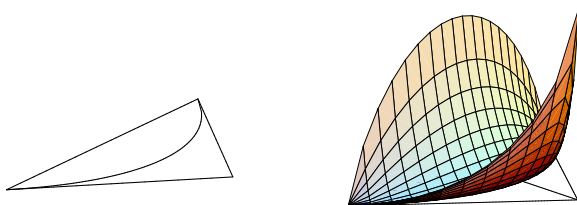
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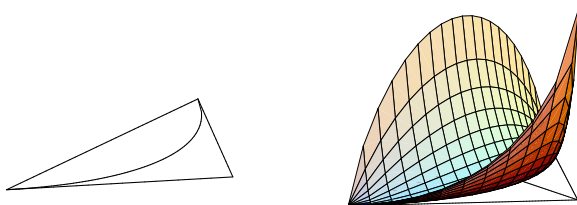
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N. Ay 2002

suggested to maximize this **distance** from exponential families



when the model consists of the factorizable distributions over a hypergraph (hierarchical log-linear models, in particular graphical Markov ones) then sometimes **maximizers correspond to the ideal sss's** (FM 2009)

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33 12 21

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A matroid (N, r) is p -representable of the degree $2/3$ iff it is linear over $\text{GF}(2)/\text{GF}(3)$. (Beimel, FM, independently)

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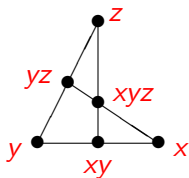
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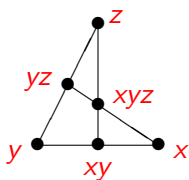
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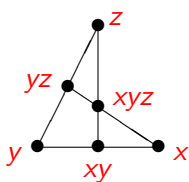


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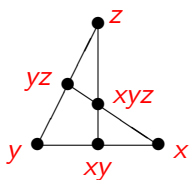
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... an equivalent definition of the group via entropy

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non-Shannon type inequalities

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