

Enumerator polynomials: Completeness and Intermediate Complexity

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Hamiltonian cycles \iff Monomials of HamC.

eg K_4 : 1-2-3-4-1: $X_{12}X_{23}X_{34}X_{41}$

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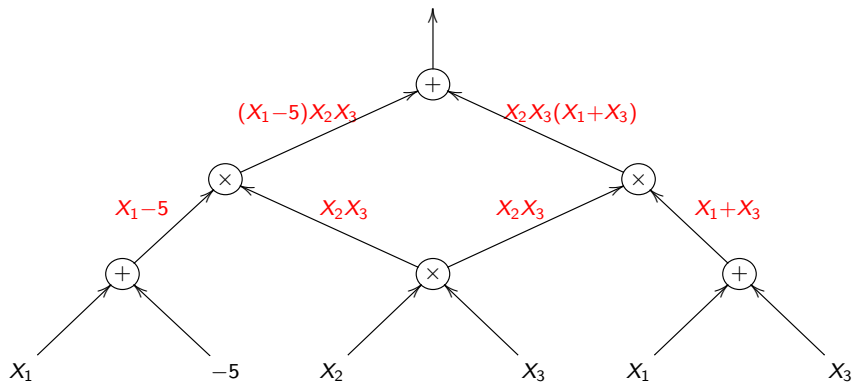
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- HamC must be “hard”. In what computation model?

Algebraic computation models: Circuits

$$2X_1X_2X_3 - 5X_2X_3 + X_2X_3^2$$



Arithmetic Circuit Families

Circuit family (C_n) computes polynomial family (p_n) .

Family $\{f_n\}_{n>0}$ is a p -family if degree and number of variables in f_n grows polynomially in n .

Now onwards, only p -families.

Algebraic Complexity Classes

- VP: *p-computability*; polynomial size circuits.
- VNP: *p-definability*; exponential sums of partial Boolean instantiations of polynomials in VP.
($f_n \in \text{VNP}$ if there exist $(g_m) \in \text{VP}$ and polynomial $r(n)$:

$$f_n(\tilde{x}) = \sum_{\tilde{y} \in \{0,1\}^{t(n)}} g_{r(n)}(\tilde{x}, \tilde{y})$$

(Defined by Valiant in 1979; algebraic analogues of P, NP.)

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projections of g		not projections of g
$y_1 + y_2$	$= g(y_1, 1, y_2, 1)$	$y_1^2 y_2$
$y_1 y_2 + 5$	$= g(y_1, y_2, 1, 5)$	(too high degree)
$y_1 y_2 + y_2 y_3$	$= g(y_1, y_2, y_2, y_3)$	$y_1 + y_2 + y_3$
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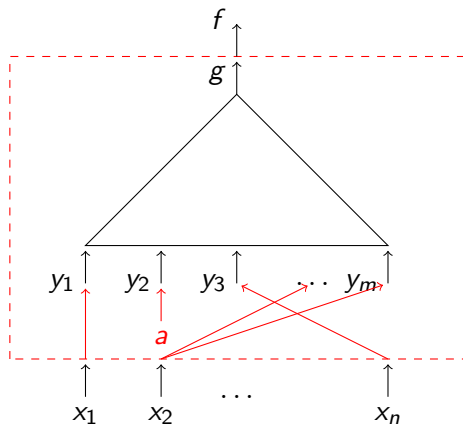
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$f \leq_{\text{proj}} g$ if circuit for g can be used to compute f ,
with no extra gates.

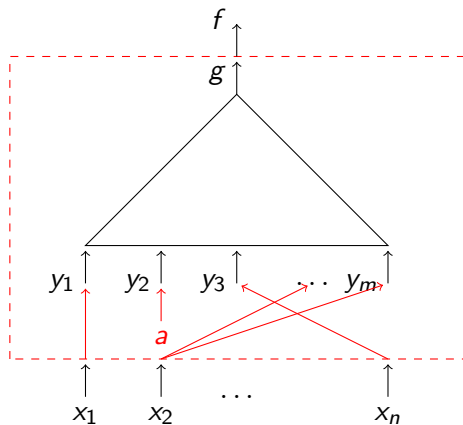
- p -projection: $f_n \leq_{\text{proj}} g_{m(n)}$ for some poly $m(\cdot)$.

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f is a p -projection of g
if $m(n) \in n^{O(1)}$.

Other Hard “Enumerator” Polynomials

- Enumerating Cliques:

$$\text{Clique}_n \triangleq \sum_{A \subseteq [n]} \left(\prod_{i,j \in A, i < j} x_{i,j} \right)$$

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- Enumerating Bipartite Perfect Matchings:

$$\text{Perm}_n \triangleq \sum_{\substack{M \text{ a perfect} \\ \text{matching in } K_{n,n}}} \left(\prod_{(u_i, v_j) \in M} x_{i,j} \right) = \sum_{\sigma \in S_n} \left(\prod_{i \in [n]} x_{i, \sigma(i)} \right)$$

VNP-complete with respect to p -projections
(over fields of characteristic $\neq 2$).

A remarkable enumerator polynomial

$$\text{Cut}_n(X) \triangleq \sum_{(A,B) \text{ partition of } [n]} \left(\prod_{i \in A, j \in B} X_{i,j} \right).$$

eg: $\text{Cut}_3(X) = 1 + X_{1,2}X_{1,3} + X_{1,2}X_{2,3} + X_{1,3}X_{2,3}.$

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Theorem (Bürgisser (1999))

*Over the field $GF[2]$,
 (Cut_n) is neither in VP, nor VNP-hard (with respect to p -projections),
unless all languages in $\oplus P \pmod{2}$ have polynomial-size circuits
and hence PH collapses to second level.*

Intermediate Complexity

- (Boolean world) Ladner's theorem (1975): If $P \neq NP$, then there is a language in NP that is neither in P nor NP -hard.
- (Algebraic world) Bürgisser (1999): Over every field, if $VP \neq VNP$, then there is a polynomial family in VNP that is neither in VP nor VNP -hard.

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Over other fields?
- Over \mathbb{R} , Cut_n is in fact VNP -complete. [deRugy-Altherre 2012]

Intermediate Complexity over finite fields

Fix field \mathbb{F}_q of size q , characteristic p .

$$\text{Cut}_n^q(X) \triangleq \sum_{(A,B) \text{ partition of } [n]} \left(\prod_{i \in A, j \in B} (X_{i,j})^{q-1} \right)$$

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Since 1999, these were the only known intermediate-complexity polynomials.

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 - Clique encoded differently.
 - Vertex Cover
 - Closed Walks
 - 3-dimensional matchings
 - 3-SAT

Clique polynomial, redefined

Old definition:

$$\text{Clique}_n \triangleq \sum_{\substack{T \subseteq E_n: (V_n, T) \text{ is clique} \\ \text{+isolated vertices}}} \left(\prod_{e \in T} x_e \right)$$

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For other fields \mathbb{F}_q :

$$\text{CIS}_n^q \triangleq \sum_{T \subseteq E_n} \left(\prod_{e \in T} (X_e)^{q-1} \right) \left(\prod_{v \text{ incident on } T} (Y_v)^{q-1} \right)$$

3Sat polynomial (over GF[2])

Cl_n : Set of all possible 3-literal clauses on n variables.

$$\text{Sat}_n \triangleq \sum_{a \in \{0,1\}^n} \left(\prod_{i \in [n]: a_i=1} X_i \right) \left(\prod_{\substack{c \in Cl_n: \\ a \text{ satisfies } c}} Y_c \right)$$

Closed-Walk polynomial (over $\text{GF}[2]$)

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Vertex Cover polynomial (over GF[2])

$$VC_n \triangleq \sum_{S \subseteq V_n} \left(\prod_{e \in E_n: e \text{ is incident on } S} x_e \right) \left(\prod_{v \in S} y_v \right)$$

3-Dimensional Matching polynomial (over GF[2])

$$3DM^n := \sum_{M \subseteq A_n \times B_n \times C_n} \left(\prod_{e \in M} X_e \right) \left(\prod_{\substack{v \in M \\ \text{(counted only once)}}} Y_v \right)$$

Why these are intermediate ...

Following Bürgisser's strategy,

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H: Hardness. The monomials of h encode solutions to a problem that is $\#\text{P}$ -hard via parsimonious reductions.

(Hence, if h is in VP, then $\oplus\text{P}$ has small circuits.)

Why Sat is intermediate

$$\text{Sat}_n \triangleq \sum_{a \in \{0,1\}^n} \left(\prod_{i \in [n]: a_i=1} X_i \right) \left(\prod_{\substack{c \in \text{Cl}_n: \\ a \text{ satisfies } c}} Y_c \right)$$

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Ease: Given a 0-1 assignment to \tilde{X} and \tilde{Y} , $\text{Sat}_n(\tilde{x}, \tilde{y})$ equals $\# \{a: x_i = 0 \implies a_i = 0 \text{ and } y_c = 0 \implies a \text{ does not satisfy } c\}$.

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Hard: Given any 3-CNF formula F on n variables with m clauses,
For clauses $c \in F$, set all $Y_c = t$; set other Y_c to 1. Set all X_i to 1.

$$\text{Sat}_n(t) = \sum_{a \in \{0,1\}^n} \left(\prod_{\substack{c \in F: \\ a \text{ satisfies } c}} t \right) = \sum_{a \in \{0,1\}^n} t^{(\text{number of clauses sat by } a)}$$

Coefficient of t^m equals $\#F \pmod{2}$.

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Discard vertices v with $Y_v = 0$; discard edges e touching discarded vertices or with $X_e = 0$.

ℓ edges remain. Each subset of these edges contributes 1.

Value: $2^\ell \pmod{2}$; 1 iff $\ell = 0$.

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Hard: Given any graph $G = (V, E)$,

Set all $Y_v = t$; Set $X_e = z$ if $e \in E$, $X_e = 1$ otherwise.

$$\text{CIS}(z, t) = \sum_{T \subseteq E_n} z^{|T \cap E(G)|} t^{(\text{number of vertices incident on } T)}$$

Coefficient of $z^{\binom{k}{2}} t^k = \text{Number of cliques of size } k, \pmod{2}$.

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$$\text{Clow}_n \triangleq \sum_{\substack{w = \langle v_0, v_1, \dots, v_{n-1} \rangle: \\ \forall j > 0, v_0 < v_j}} \left(\prod_{i \in [n]} X_{(v_{i-1}, v_i \bmod n)} \right) \left(\prod_{v \in \{v_0, v_1, \dots, v_{n-1}\}} Y_v \right)$$

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$$\text{Clow}(z, t) = \sum_{w: \text{clow of length } n} z^{|w \cap E|} t^{(\text{number of vertices in } w)}$$

Coefficient of $z^n t^n = \text{Number of Hamilton cycles (mod 2)}$.

Enumerating Graph Homomorphisms

Graphs G, H .

Homomorphism from G to H :

a map $\phi : V(G) \rightarrow V(H)$ preserving adjacencies.

- Object of interest: Homomorphism from G to H
- Q1: Is there a homomorphism $G \rightarrow H$?
- Q2: How many homomorphisms?
- Q3: Describe all homomorphisms; Enumerate them symbolically.

Enumerator Polynomial for Homomorphisms

Graphs G, H .

Variables on edges of H . (Think of G as fixed.)

$$f_{G,H} \triangleq \sum_{\phi: \text{homomorphism } G \rightarrow H} \left(\prod_{(u,v) \in E(G)} Y_{(\phi(u), \phi(v))} \right)$$

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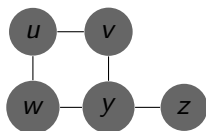
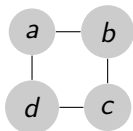
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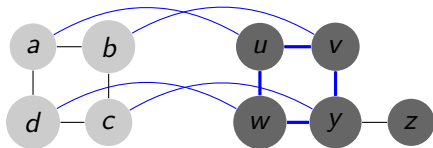
$(G_n), (H_n)$: p -families of graphs. (size grows polynomially with n)

$$f_n = f_{G_n, H_n}.$$

Homomorphism Polynomials (continued)



Homomorphism Polynomials (continued)



Homomorphism

$$a \rightarrow u$$

$$b \rightarrow v$$

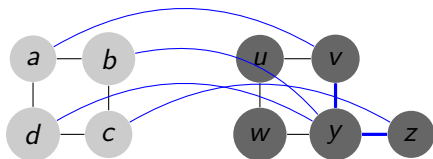
$$c \rightarrow y$$

$$d \rightarrow w$$

Monomial

$$Y_{u,v} Y_{v,y} Y_{y,w} Y_{u,w}$$

Homomorphism Polynomials (continued)



Homomorphism

$$a \rightarrow v$$

$$b \rightarrow y$$

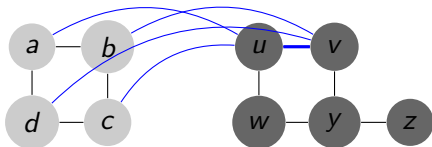
$$c \rightarrow z$$

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Monomial

$$Y_{v,y}^2 Y_{y,z}^2$$

Homomorphism Polynomials (continued)



Homomorphism Monomial

$$a \rightarrow u$$

$$b \rightarrow v$$

$$c \rightarrow u$$

$$d \rightarrow v$$

$$Y_{u,v}^4$$

Rigid, incomparable graphs

- A rigid: the only homomorphism from A to A is the identity.
Asymptotically, almost all graphs are rigid.

Rigid, incomparable graphs

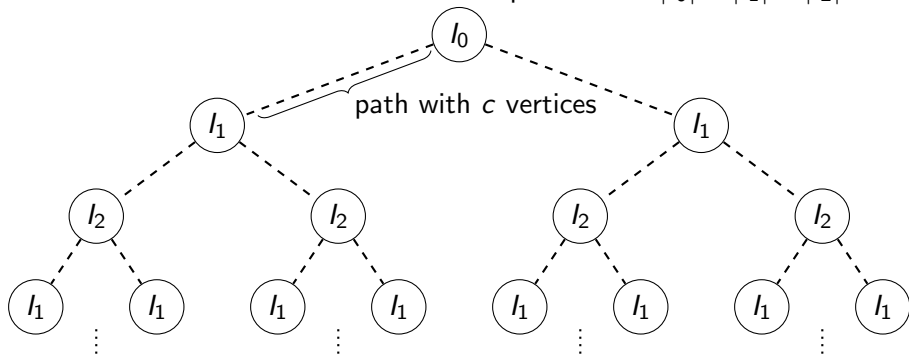
- A rigid: the only homomorphism from A to A is the identity.
Asymptotically, almost all graphs are rigid.
- $A \rightarrow B$: there exists a homomorphism from A to B .
 $A \not\rightarrow B$: there exists no homomorphism from A to B .
 A, B , incomparable: $A \not\rightarrow B$ and $B \not\rightarrow A$.
Asymptotically, almost all pairs of graphs are incomparable.

Describing our graph families

The family (G_n) :

l_0, l_1, l_2 : any three rigid pairwise incomparable graphs.

Mark three nodes in each as attachment points. $c = |l_0| + |l_1| + |l_2|$.



What we show:

- The family (G_n) : complete binary tree with $2^{\lceil \log n \rceil}$ leaves, “inflated” by three rigid pairwise-incomparable graphs, and “stretched” with long paths.
- The family (H_n) : complete graph on n^6 vertices.

$$f_{G,H} = \sum_{\psi: V(G) \rightarrow n^6} \left(\prod_{(u,v) \in E(G)} Y_{(\psi(u), \psi(v))} \right)$$

- The family $(f_{G,H})$ is complete for VP w.r.t. p -projections.

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- The family (G_n) : simple path, “stretched”, endpoints “inflated” to rigid pairwise-incomparable graphs.
 - The family (H_n) : complete graph on n^2 vertices.
 - The family $(f_{G,H})$ is complete for **VBP** w.r.t. p -projections.

What's the big deal?

- For VP, first natural complete family whose definition is independent of circuits and where completeness is w.r.t. p -projections.
(Earlier work by Durand, Malod, M, Rigny-Altherre, Saurabh (2014) gave completeness w.r.t. oracle reductions, or for more artificial homomorphisms with labels and weights.)

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- For VBP, complete polynomials were known – determinant, iterated matrix multiplication. This is one more.
- Our upper bounds hold whenever G_n is bounded tree-width / path-width and H_n is complete.
(Dynamic programming approach using nice normal-form tree-width/path-width decompositions of G_n .)

Monotone p -projections

- Even more restrictive than p -projections.
- Recall projection: $f \leq_{proj} g$ if circuit for g can be used to compute f , with no extra gates.

Now monotone projections: $f \leq_{m-proj} g$ if circuit for g can be used to compute f , with no extra gates, without using “negative” constants.

(Makes sense over totally ordered semi-ring.
eg \mathbb{R} , \mathbb{Q} , Boolean semi-ring.)

Why bother?

Goal: to get lower bounds for restricted circuits.

- Jukna: If HamC_n is a monotone p -projection of Perm_n , then monotone Boolean circuits for the Permanent must be of $2^{n^{\Omega(1)}}$ size.
Current best lower bound: $n^{\log n}$ size. (Razborov 1985)
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Over reals, lower bound $2^{\Omega(n)}$. (Jerrum, Snir 1982)
- Grochow 2015: Any monotone projection from Perm to HamC needs exponential blowup.
If $\text{HamC}_n \leq_{m\text{-proj}} \text{Perm}_{t(n)}$, then $t(n) = 2^{\Omega(n)}$.

What we show:

- Over the reals (or any totally ordered semi-ring), the families Sat and Clow are not monotone p -projections of Perm.
- Any monotone affine projection from Perm to Sat must have a blow-up of at least $2^{\Omega(\sqrt{n})}$.
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- Any monotone affine projection from Perm to Clow must have a blow-up of at least $2^{\Omega(n)}$.
- More recently, Nitin Saurabh showed: Any monotone affine projection from Perm to Clique must have a blow-up of at least $2^{\Omega(\sqrt{n})}$.

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- Suppose Sat_n is a monotone projection of Perm_t . Then Sat_n polytope can be described with $O(t(n))$ inequalities. (using Grochow 2015)
- For Clow_n , polytope in \mathbb{R}^{n^2} , convex hull of clows.
The Travelling SalesPerson (TSP) polytope is embedded in it.
Any extension of TSP needs $2^{\Omega(n)}$ inequalities. (Rothvoss 2014)

Summary

- 1 Over finite fields, five families of enumerator polynomials shown to have complexity intermediate between VP and VNP, assuming the PH does not collapse to second level.
- 2 Over \mathbb{R} and \mathbb{Q} , two of these families proved to require exponential blowup when expressed as monotone p -projections of the permanent.
- 3 Enumerator polynomials for graph homomorphisms: Rich canvas.
 - First natural family of polynomials defined independent of circuits and shown VP-complete w.r.t. p -projections.
 - Smooth transition to VBP-complete family.
 - VNP-complete variants also exist.

Future Directions

- Can we find polynomials with intermediate complexity over all fields? all fields with non-0 characteristic? all finite fields? all finite fields with characteristic p ? finite fields with infinitely many different characteristics?
- Are there polynomials with intermediate complexity over some finite fields but obtainable as monotone p -projections of the permanent?
- Can we find polynomials enumerating homomorphisms, with intermediate complexity?

Thank You!