

The Difficulty of Counting:

Dichotomy Theorems for Generalized Chromatic Polynomials.

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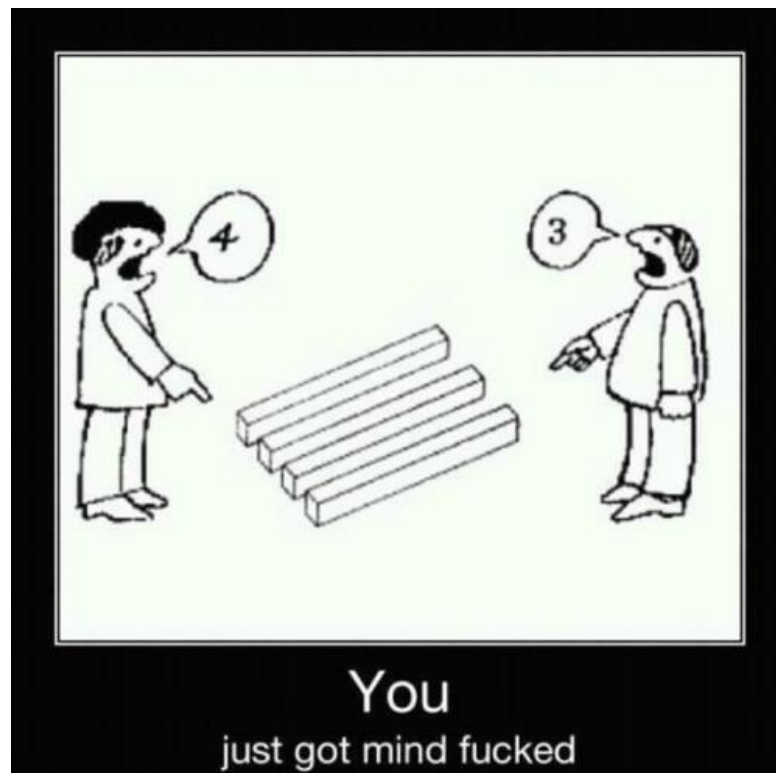
Partially joint work with

A. Goodall, M. Hermann, T. Kotek, S. Noble and E.V. Ravve.

Graph polynomial project:

<http://www.cs.technion.ac.il/~janos/RESEARCH/gp-homepage.html>

The Difficulty of Counting



Intriguing Graph Polynomials



Boris Zilber and JAM, September 2004, in Oxford

BZ: What are you studying nowadays?

JAM: Graph polynomials.

BZ: Uh? What? Can you give examples

JAM: Matching polynomial, chromatic polynomial, Tutte polynomial, characteristic polynomial, ... (detailed definitions) ...

BZ: I know these! They all occur as growth polynomials in my work on \aleph_0 -categorical, ω -stable models!

JAM: ??? Let's see!

A detailed exposition of the work which resulted from this conversation can be found in:

Model Theoretic Methods in Finite Combinatorics

M. Grohe and J.A. Makowsky, eds.,
Contemporary Mathematics, vol. 558 (2011), pp. 207-242
American Mathematical Society, 2011

Especially the papers

- **On Counting Generalized Colorings**
T. Kotek, J. A. Makowsky, and **B. Zilber**
- *Application of Logic to Combinatorial Sequences and Their Recurrence Relations*
E. Fischer, T. Kotek, and J. A. Makowsky
- *Counting Homomorphisms and Partition Functions*
M. Grohe and M. Thurley

Related Ph.D. Theses under my supervision



- I. Averbouch,
Completeness and Universality Properties of Graph Invariants and Graph Polynomials
Technion - Israel Institute of Technology, Haifa, Israel, 2011



- T. Kotek,
Definability of combinatorial functions,
Technion - Israel Institute of Technology, Haifa, Israel, 2012

Outline of this talk

- One, two, many "chromatic" polynomials
- Computing graph polynomials over the real or complex numbers
Turing vs Blum-Shub-Smale computability
- Difficult Point Property (DPP)
- Univariate case
- Conclusion and many open problems

Dagstuhl, January 2013

Earlier versions of this talk can be found at

- J.A. Makowsky and T. Kotek and E.V. Ravve,
A Computational Framework for the Study of Partition Functions and
Graph Polynomials,
Proceedings of the 12th Asian Logic Conference '11,
World Scientific, 2013, pp 210-230.
- Talk given at the Dagstuhl Seminar 13031
Computational Counting
January 13-18, 2013
Organizers:
[Peter Bürgisser](#), [Leslie Ann Goldberg](#), [Mark R. Jerrum](#), [Pascal Koiran](#)

In this talk we examine our earlier **premature conjectures**,
give counter-examples,
and propose revised **Open Problems**

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One, two, many chromatic polynomials

The prototype: The chromatic polynomial

Let G be a graph and $[k] = \{1, 2, \dots, k\}$. We think of $[k]$ as colors.

A function $c : V(G) \rightarrow [k]$ is a proper coloring of G with at most k colors, if for each $i \in [k]$ the set $c^{-1}(i)$ is an independent set in G .

We denote by $\chi(G; k)$ the number of proper colorings of G with k colors.

Birkhoff (1912) showed that $\chi(G; k)$ is a polynomial in $\mathbb{Z}[k]$. Furthermore, he showed that for the edgeless graph with n vertices, $E_n = ([n], \emptyset)$ we have that $\chi(E_n; k) = k^n$ and

$$\chi(G_{/e}; k) = \chi(G; k) + \chi(G_{\setminus e}; k)$$

where $e \in E(G)$ and $G_{/e}$ is obtained by **deleting** the edge e and $G_{\setminus e}$ is obtained by **contracting** the edge e .

This shows that $\chi(G; k)$ is a **polynomial counting colorings** and that $\chi(G; k)$ has a **recursive definition**,

and can be **extended** to a polynomial $\chi(G; X) \in \mathbb{R}[X]$.

Deletion and contraction

- Proving that $\chi(G; X)$ is a graph polynomial using **deletion** and **contraction** is very **elegant**, and led to the theory of **graph minors**.
- However, this proof is **restricted** to graph polynomials which are **related to the Tutte polynomial via the recipe theorem**.
- **B. Zilber's observation**, stripped to its basics, shows that counting other graph colorings of a graph G with k colors leads, for each graph G , to a polynomial in k .

The elementary generic proof

THEOREM:

For every graph G , the counting function $\chi(G, k)$ is a polynomial in k of the form

$$\sum_{j=0}^{|V(G)|} c(G, j) \binom{k}{j}$$

where $c(G, j)$ is the number of proper k -colorings with a fixed set of j colors.

Polynomials in $\mathbb{Z}[k]$ with monomials of the form $\binom{k}{j}$ are sometimes called **Newton polynomials**.

Proof

A **proper** coloring uses at most $N = |V(G)|$ of the k colors.

For any $j \leq N$, let $c(G, j)$ be the number of **proper** colorings, with a fixed set of j colors, which are **proper** colorings and use all j of the colors.

We observe:

(A): Every permutation of the set of colors used gives also a **proper** coloring.

(B): Colors not used do not have an effect on being a **proper** coloring.

Therefore, given k colors, the number of vertex colorings that use exactly j of the k colors is the product of $c(G, j)$ and the binomial coefficient $\binom{k}{j}$. So

$$\chi(G, k) = \sum_{j \leq N} c(G, j) \binom{k}{j}$$

The right side here is a polynomial in k , because each of the binomial coefficients is. We also use that for $k \leq j$ we have $\binom{k}{j} = 0$. Q.E.D.

Variations on coloring, I

Using properties **(A)** and **(B)** we get variations of chromatic polynomials:

We can count other coloring functions.

- **proper k -edge-colorings:**

$f_E : E(G) \rightarrow [k]$ such that if $(e, f) \in E(G)$ have a common vertex then $f_E(e) \neq f_E(f)$.

$\chi_e(G, k)$ denotes the number of k - edge-colorings

- **Total colorings**

$f_V : V \rightarrow [k_V]$, $f_E : E \rightarrow [k_E]$ and $f = f_V \cup f_E$,

with f_V a proper vertex coloring and f_E a proper edge coloring.

- **Connected components**

$f_V : V \rightarrow [k_V]$, If $(u, v) \in E$ then $f_V(u) = f_V(v)$.

- **Hypergraph colorings**

Vitaly I. Voloshin, Coloring Mixed Hypergraphs: Theory, Algorithms and Applications, Fields Institute Monographs, AMS 2002

Variations on coloring, II

Let $f : V(G) \rightarrow [k]$ be a function, such that Φ is one of the properties below and $\chi_\Phi(G, k)$ denotes the number of such colorings with at most k colors.

For **(*)**, $\chi_\Phi(G, k)$ satisfies **(A)** and **(B)**, hence is a polynomial in k , for **(-)**, it is not.

- **complete:** f is a **proper** coloring such that **every pair of colors occurs along some edge**.

F. Harary and S. Hedetniemi and G. Prins, An interpolation theorem for graphical homomorphisms, Portugal. Math., 26 (1967), 453-462.

* **harmonious:** f is a **proper** coloring such that **every pair of colors occurs at most once along some edge**.

J.E. Hopcroft and M.S. Krishnamoorthy, On the harmonious coloring of graphs, SIAM J. Algebraic Discrete Methods, 4 (1983), 306-311.

* **convex:** Every monochromatic set induces a **connected graph**.

S. Moran and S. Snir, Efficient approximation of convex recolorings, Journal of Computer and System Sciences, 73.7 (2007), 1078-1089

Variations on coloring, III

More coloring polynomials in $\mathbb{Z}[k]$:

- * **injective:** f is injective on the neighborhood of every vertex.

G. Hahn and J. Kratochvíl and J. Siran and D. Sotteau, On the injective chromatic number of graphs, *Discrete mathematics*, 256.1-2, (2002), 179-192.

- * **path-rainbow:** Let $f : E \rightarrow [k]$ be an edge-coloring. f is **path-rainbow** if between any two vertices $u, v \in V$ there is a path where all the edges have different colors.

Rainbow colorings of various kinds arise in computational biology

Rainbow connection in graphs, G. Chartrand and G.L. Johns and K. McKeon A and P. Zhang, *Mathematica Bohemica*, 133.1, (2008), 85-98.

- * **monochromatic components:** Let $f : V \rightarrow [k]$ be a vertex-coloring and $t \in \mathbb{N}$. f is an mcc_t -coloring of G with k colors, if all the connected components of a monochromatic set have size at most t . N. Alon, G. Ding, B. Oporowski, and D. Vertigan. Partitioning into graphs with only small components. *Journal of Combinatorial Theory, Series B*, 87:231–243, 2003.

Variations on coloring, IV

Let \mathcal{P} be any graphs property and let $n \in \mathbb{N}$.

We can define coloring functions $f : V \rightarrow [k]$ by requiring that the union of any n color classes induces a graph in \mathcal{P} .

- For $n = 1$ and \mathcal{P} the **empty graphs** $G = (V, \emptyset)$ we get the **proper colorings**.
- For $n = 1$ and \mathcal{P} the **connected graphs** we get the **convex colorings**.
- For $n = 1$ and \mathcal{P} the graphs which are **disjoint unions of graphs of size at most t** , we get the **mcc_t -colorings**.
- For $n = 2$ and \mathcal{P} the **acyclic graphs** we get the **acyclic colorings**, introduced in: [B. Grunbaum, Acyclic colorings of planar graphs, Israel J. Math. 14 \(1973\), 390-412](#) and further studied in N.Alon , C. Mcdiarmid, B. Reed, Acyclic coloring of graphs, Random Structures & Algorithms 2.3 (1991) 277-288.

Theorem: Let $\chi_{\mathcal{P},n}(G, k)$ be the number of colorings of G with k colors such that the union of any n color classes induces a graph in \mathcal{P} .

Then $\chi_{\mathcal{P},n}(G, k)$ is a polynomial in k .

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Equivalence of graph polynomials

with E.V. Ravve

Two graph polynomials $P(G; X)$ and $Q(G; X)$ are **d.p.-equivalent** if for all graphs G_1, G_2 we have

$$P(G_1, X) = P(G_2, X) \text{ iff } Q(G_1, X) = Q(G_2, X)$$

Theorem:(JAM and E.V. Ravve)

Let \mathcal{P} and \mathcal{Q} be two graph properties.

$\chi_{\mathcal{P},1}(G, k)$ is d.p.-equivalent to $\chi_{\mathcal{Q},1}(G, k)$ iff $\mathcal{P} = \mathcal{Q}$ or $\mathcal{P} = \bar{\mathcal{Q}}$.

Conclusion: There uncountably many generalized chromatic polynomials.

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[Skip multivariate and go to DPP](#), [Skip multivariate and go to BSS](#),

Variations on colorings, V: Two kinds of colors.

Let $G = (V, E)$.

Here we look at two disjoint color sets $A = [k_1]$ and $B = [k_1 + k_2] - [k_1]$. The colors in A are called **proper** colors.

Our coloring is a function $f : V \rightarrow [k_1 + k_2] = [k]$ such that

- If $(u, v) \in E$ and $f(u) \in A$ and $f(v) \in A$ then $f(u) \neq f(v)$.
- We count the number of colorings with $k = k_1 + k_2$ colors such that k_1 colors are in A , i.e., **proper**.

Theorem 1 (K. Dohmen, A. Pönitz and P. Tittman, 2003)

This gives us a polynomial $P(G, k_1, k)$ in k_1 and k .

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Computing chromatic polynomials

Turing computability vs Computability over \mathbb{R} or \mathbb{C} .

An in-depth discussion can be found in:

- J.A. Makowsky and T. Kotek and E.V. Ravve,
A Computational Framework for the Study of Partition Functions and Graph Polynomials,
Proceedings of the 12th Asian Logic Conference '11,
World Scientific, 2013, pp. 210-230

Evaluations of graph polynomials, I

Let $P(G; \vec{X})$ be a graph polynomial in the indeterminates X_1, \dots, X_n .

Let \mathcal{R} be a subfield of the complex numbers \mathbb{C} .

For $\vec{a} \in \mathcal{R}^n$, $P(-; \vec{a})$ is a graph invariant taking values in \mathcal{R} .

We could restrict the graphs to be from a class (graph property) \mathcal{C} of graphs.

What is the complexity of computing $P(-; \vec{a})$ for graphs from \mathcal{C} ?

- If for all graphs $G \in \mathcal{C}$ the value of $P(-; \vec{a})$ is a graph invariant taking values in \mathbb{N} , we can work in the **Turing model of computation**.
- Otherwise we identify the graph G with its **adjacency matrix** M_G , and we work in the **Blum-Schub-Smale (BSS) model of computation**.

Our goal

We want to discuss and **extend** the classical result of

F. Jaeger and D.L. Vertigan and D.J.A. Welsh

on the complexity of evaluations of the Tutte polynomial. They show:

- either evaluation at a point $(a, b) \in \mathbb{C}^2$ is polynomial time computable in the Turing model, and a and b are integers,
- or some $\#\mathbf{P}$ -complete problem is reducible to the evaluation at $(a, b) \in \mathbb{C}^2$.
- To stay in the **Turing model** of computation, they assume that (a, b) is in some finite dimensional extension of the field \mathbb{Q} .

The proof of the second part is a **hybrid statement**:

The reduction is more naturally placed in the **BSS model** of computation, **However**, $\#\mathbf{P}$ -completeness has **no suitable counterpart** in the BSS model.

Pseudo- $\#P$ -completeness

Authors often use implicitly the following **hybrid** definition:

The evaluation of $P(-, \bar{a})$ with $\bar{a} \in \mathbb{C}^m$ is (**pseudo**)- $\#P$ hard (or complete) if

- There is $\bar{c} \in \mathbb{C}^m$ with $P(-, \bar{c}) \in \#P$ and $\#P$ -complete in the Turing model, and
- $P(-, \bar{c}) \leq_{\text{algebraically}} P(-, \bar{a})$,
where the reduction $\leq_{\text{algebraically}}$ is given
no precise definition, but can be given easily subject to minor variations.

It seems to us **more natural** to work **entirely** in the BSS model of computation.

How exactly ?

Evaluations of graph polynomials, II

- A **graph invariant** or **graph parameter** is a function $f : \bigcup_n \{0, 1\}^{n \times n} \rightarrow \mathcal{R}$ which is invariant under permutations of columns and rows of the input adjacency matrix.
- A **graph transformation** is a function $T : \bigcup_n \{0, 1\}^{n \times n} \rightarrow \bigcup_n \{0, 1\}^{n \times n}$ which is invariant under permutations of columns and rows of the input adjacency matrix.
- The **BSS-P-time computable functions** over \mathcal{R} , $P_{\mathcal{R}}$, are the functions $f : \{0, 1\}^{n \times n} \rightarrow \mathcal{R}$ BSS-computable in time $O(n^c)$ for some fixed $c \in \mathbb{N}$.
- Let f_1, f_2 be graph invariants. f_1 is **BSS-P-time reducible to f_2** , $f_1 \leq_P f_2$ if there are BSS-P-time computable functions T and F such that
 - (i) T is a graph transformation ;
 - (ii) For all graphs G with adjacency matrix M_G we have

$$f_1(M_G) = F(f_2(T(M_G)))$$
- two graph invariants f_1, f_2 are **BSS-P-time equivalent**, $f_1 \sim_{BSS-P} f_2$, if $f_1 \leq_{BSS_P} f_2$ and $f_2 \leq_{BSS_P} f_1$.

Evaluations of graph polynomials, III: Degrees and Cones

What are difficult graph parameters in the **BSS-model**?

Let g, g' be a graph parameters computable in exponential time in the **BSS-model**, i.e., $g, g' \in EXP_{BSS}$.

BSS-Degrees We denote by $[g]_{BSS}$ and $[g]_T$ the equivalence class (BSS-degree) of all graph parameters $g' \in EXP_{BSS}$ under the equivalence relation \sim_{BSS-P} .

BSS-Cones We denote by $\langle g \rangle_{BSS}$ the class (BSS-cone) $\{g' \in EXP_{BSS} : g \leq_{BSS-P} g'\}$.

NP-completeness There are BSS-NP-complete problems, and instead of specifying them, we consider NP to be a degree (which may vary with the choice of the Ring \mathcal{R}).

NP-hardness The cone of an NP-complete problem forms the NP-hard problems.

Evaluations of graph polynomials, IV

We work in **BSS model** over \mathcal{R} .

We define

$$\text{EASY}_{BSS}(P, \mathcal{C}) = \{\bar{a} \in \mathcal{R}^n : P(-; \bar{a}) \text{ is BSS-P-time computable} \}$$

and

$$\text{HARD}_{BSS}(P, \mathcal{C}) = \{\bar{a} \in \mathcal{R}^n : P(-; \bar{a}) \text{ is BSS-NP-hard} \}$$

We use $\text{EASY}_{BSS}(P)$ and $\text{HARD}_{BSS}(P)$ if \mathcal{C} is the class of all finite graphs.

How can we describe $\text{EASY}(P, \mathcal{C})$ and $\text{HARD}(P, \mathcal{C})$?

Counting Complexity Classes in the BSS-model, I

K. Meer (2000) introduced an analogue of $\#\mathbf{P}$ for discrete counting in the BSS model which can easily be extended to the BSS model over \mathbb{C} .

- A *counting function* over \mathbb{C} is a function $f : \mathbb{C}^\infty \rightarrow \mathbb{N} \cup \{\infty\}$.
- For a complexity class of functions FC we denote by FC^{count} the class of counting functions in FC .
- A function f is in $\#\mathbf{P}_{\mathbb{C}}$ if there exists a polynomial time BSS-machine over \mathbb{C} and a polynomial q such that

$$f(y) = |\{z \in \mathbb{C}^{q(\text{size}(y))} : M(y, z) \text{ accepts}\}|$$

- For every sub-field \mathcal{R} of \mathbb{C} we have $\text{FP}_{\mathcal{R}}^{\text{count}} \subseteq \#\mathbf{P}_{\mathcal{R}} \subseteq \text{FE}_{\mathcal{R}}$.

Typical examples over the reals \mathbb{R} are counting zeroes of multivariate polynomials of degree at most 4 ($\#\mathbf{4} - \text{FEAS}$) or counting the number of sign changes of a sequence of real numbers ($\#\mathbf{SC}$).

Counting Complexity Classes in the BSS-model, II

Proposition: Over \mathbb{C} the number of k -colorings of a graph is in $\#\mathbf{P}_{\mathbb{C}}$.

To see this, we associate with a graph $G = (V, E)$ with $V = \{1, \dots, n\} = [n]$ the following set $\mathcal{E}_{color}^k(G)$ of equations:

$$(i) \quad x_i^k - 1 = 0, i \in [n]$$

$$(ii) \quad \sum_{d=0}^{k-1} x_i^{k-1-d} x_j^d, (i, j) \in E.$$

Clearly, $\mathcal{E}_{color}^k(G)$ has at most k^n many complex solutions.

D.A. Beyer in his Ph.D. thesis (1982) observed that a graph G is k -colorable iff $\mathcal{E}_{color}^k(G)$ has a complex solution, and each solution corresponds exactly to proper k -coloring of G .

In S. Margulies' Ph.D. thesis (2008) it is shown:

Theorem: Every decision problem in \mathbf{NP} (in the Turing model) can be encoded as solvability problem of sets of equations over \mathbb{C} .

Using the fact that $\#\mathbf{SAT}$ is $\#\mathbf{P}$ complete we get:

Theorem: Every function $f \in \#\mathbf{P}$ (in the Turing model) has an encoding in $\#\mathbf{P}_{\mathbb{C}}$ (in the BSS model).

The difficult counting hypothesis (**DCH**)

- In the literature there are no **explicit graph parameters** which are $\#\mathbf{P}_{\mathbb{C}}$ -complete problems.
- Counting the number of colorings is not known to be $\mathbf{NP}_{\mathbb{C}}$ -hard in the BSS-model. On the other hand, it would be **truly surprising** if counting the number of k -colorings were in $\mathbf{FP}_{\mathbb{C}}^{\text{count}}$.

Hence we formulate two complexity hypotheses for the BSS model over \mathbb{C} :

SDHC: Strong difficult counting hypothesis

Every counting function in $f \in \#\mathbf{P}_{\mathbb{C}}$ with discrete input which is $\#\mathbf{P}$ -hard in the Turing model is $\mathbf{NP}_{\mathbb{C}}$ -hard in the BSS model over \mathbb{C} .

WDCH: Weak difficult counting hypothesis

A counting function in $f \in \#\mathbf{P}_{\mathbb{C}}$ which is $\#\mathbf{P}$ -hard in the Turing model cannot be in $\mathbf{FP}_{\mathbb{C}}^{\text{count}}$.

If $\mathbf{P}_{\mathbb{C}} \neq \mathbf{NP}_{\mathbb{C}}$ then **SDCH** implies **WDCH**.

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Computing the chromatic polynomial and the Tutte polynomial, revisited

The complexity of the chromatic polynomial, I

Theorem:

- $\chi(G, 0)$, $\chi(G, 1)$ and $\chi(G, 2)$ are P-time computable (Folklore)
- $\chi(G, 3)$ is $\#\mathbf{P}$ -complete (Valiant 1979).
- $\chi(G, -1)$ is $\#\mathbf{P}$ -complete (Linial 1986).

Question:

What is the complexity of computing $\chi(G, \lambda)$ for

$\lambda = \lambda_0 \in \mathbb{Q}$

or even for

$\lambda = \lambda_0 \in \mathbb{C}$?

The complexity of the chromatic polynomial, II

Linial's Trick

Let $G_1 \bowtie G_2$ denote the join of two graphs.

We observe that

$$\chi(G \bowtie K_n, \lambda) = (\lambda)^n \cdot \chi(G, \lambda - n) \quad (\star)$$

Hence we get

$$(i) \quad \chi(G \bowtie K_1, 4) = 4 \cdot \chi(G, 3)$$

$$(ii) \quad \chi(G \bowtie K_n, 3 + n) = (n + 3)^n \cdot \chi(G, 3)$$

hence for $n \in \mathbb{N}$ with $n \geq 3$ it is **#P-complete**.

This works in the Turing model of computation

for λ in some Turing-computable field extending \mathbb{Q} .

The complexity of the chromatic polynomial, III

If we have an oracle for some $q \in \mathbb{Q} - \mathbb{N}$ which allows us to compute $\chi(G, q)$ we can compute $\chi(G, q')$ for any $q' \in \mathbb{Q}$ as follows:

Algorithm $A(q, q', |V(G)|)$:

- (i) Given G the degree of $\chi(G, q)$ is at most $n = |V(G)|$.
- (ii) Use the oracle and (\star) to compute $n + 1$ values of $\chi(G, \lambda)$.
- (iii) Using Lagrange interpolation we can compute $\chi(G, q')$ in polynomial time.

We note that this algorithm is purely algebraic and works for all graphs G , $q \in (F) - \mathbb{N}$ and $q' \in F$ for any field F extending \mathbb{Q} .

Hence we get that for all $q_1, q_2 \in \mathbb{C} - \mathbb{N}$ the graph parameters are **polynomially reducible to each other**.

Furthermore, for $3 \leq i \leq j \in \mathbb{N}$, $\chi(G, i)$ is reducible to $\chi(G, j)$.

This works in the BSS-model of computation.

The complexity of the chromatic polynomial, IV

We summarize the situation for the chromatic polynomial as follows:

- (i) $EASY_{BSS}(\chi) = \{0, 1, 2\}$ and $HARD_{BSS}(\chi) = \mathbb{C} - \{0, 1, 2\}$.
- (ii) $HARD_{BSS}(\chi)$ can be split into two sets:
 - (ii.a) $HARD_{\#P}(\chi)$: the graph parameters which are **counting functions** in $\#P$ in the sense of Valiant, with $\chi(-, 3) \leq_P \chi(-, j)$ for $j \in \mathbb{N}$ and $3 \leq j$.
All graph parameters in $HARD_{\#P}(\chi)$ are $\#P$ -complete in **the Turing model**.
 - (ii.b) $HARD_{BSS-NP}(\chi)$: the graph parameters which are **not counting functions**.
In the **BSS model** they are all **polynomially reducible to each other**, and all graph parameters in $HARD_{\#P}(\chi)$ are P-reducible to each of the graph parameters in $HARD_{BSS}(\chi)$.
 - (ii.c) In the **BSS-model** the graph parameter $\chi(-, 3)$ is P-reducible to all the parameters in $HARD_{BSS}(\chi)$.
 - (ii.d) Inside $HARD_{BSS}(\chi)$ we have:

$$\chi(-, 3) \leq_{BSS_P} \chi(-, 4) \leq_{BSS_P} \dots \chi(-, j) \dots \leq_{BSS-P} \chi(-, a) \sim_{BSS_P} \chi(-, -1)$$
 with $j \in \mathbb{N} - \{0, 1, 2\}$ and $a \in \mathbb{C} - \mathbb{N}$.

The complexity of the chromatic polynomial, χ

We have a **Dichotomy Theorem** for the evaluations of $\chi(-, \lambda)$:

(i) $\text{EASY}_{BSS}(\chi) = \{0, 1, 2\}$

Over \mathbb{C} this is a **quasi-algebraic set** (a finite boolean combination of algebraic sets) of **dimension 0**.

(ii) All graph parameters in $\text{HARD}_{BSS}(\chi)$

are at least as difficult as $\chi(-, 3)$

(via **BSS-P-reductions**)

This is a **quasi-algebraic set of dimension 1**.

Evaluating the Tutte polynomial (Jaeger, Vertigan, Welsh)

The Tutte polynomial $T(G, X, Y)$ is a bivariate polynomial and $\chi(G, \lambda) \leq_P T(G, 1 - \lambda, 0)$.

We have the following **Dichotomy Theorem**:

- (i) $\text{EASY}_{BSS}(T) = \{(x, y) \in \mathbb{C}^2 : (x - 1)(y - 1) = 1\} \cup \text{Except}$, with
 $\text{Except} = \{(0, 0), (1, 1), (-1, -1), (0, -1), (-1, 0), (i, -i), (-i, i), (j, j^2), (j^2, j)\}$
and $j = e^{\frac{2\pi i}{3}}$
Over \mathbb{C} this is a **quasi-algebraic** set of **dimension 1**.

- (ii) All graph parameters in $\text{HARD}_{BSS}(T)$ are at least as hard as $T(G, 1 - \lambda, 0)$.
This is a **quasi-algebraic** set of **dimension 2**.

The proof and its generalizations

Variations on Linial's Trick

- (\star) is replaced by two (or more) operations:
stretching and **thickening**.
- **Lagrange interpolation** is done on a **grid**.
- There are considerable **technical challenges** in **details** of the proof for the **Tutte polynomial**.
- Although in all **successful generalizations** to other cases, the same **general outline of the proof** is always similar, **substantial challenges in the details** have to be overcome.

How hard is $\#3\text{COL} = \chi(-, 3)$?

- In the Turing model $\chi(-, 3)$ and $\chi(-, -1)^2$ are both in $\#\mathbf{P}$ and $\chi(-, 3) \leq_P \chi(-, -1)$.
As $\chi(-, 3)$ is $\#\mathbf{P}$ -complete, they are both $\#\mathbf{P}$ -complete.

In BSS this does not work!

- For \mathbb{C} , Malajovich and Meer (2001) proved an analogue of Ladner's Theorem for the **BSS-model** over \mathbb{C} :
Assuming that $\mathbf{P}_{\mathbb{C}} \neq \mathbf{NP}_{\mathbb{C}}$ there are infinitely many different BSS-degrees between them.
- Although the problem $\chi(-, 3) \neq 0?$ is in $\mathbf{NP}_{\mathbb{C}}$ we do not know whether there is $a \in \mathbb{C} - \mathbb{N}$ for which computing $\chi(-, a)$ is really harder!
- In particular, we know that $\chi(a, 3) \leq_{BSS-P} \chi(-, -1)$,
but we do not know whether $\chi(a, -1) \leq_{BSS-P} \chi(-, 3)$

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Problems with hybrid complexity, I

Let f_1, f_2 be two graph parameters taking values in \mathbb{N} as a subset of the ring \mathcal{R} .

We have **two kind of reductions**:

- **T-P-time Turing reductions** (via oracles) in the Turing model.
 $f_1 \leq_{T-P} f_2$ iff f_1 can be computed in T-P-Time using f_2 as an oracle.
- **BSS-P-time reductions** over the ring \mathcal{R} .
 $f_1 \leq_{BSS-P} f_2$ iff f_1 can be computed in BSS-P-Time using f_2 as an oracle.
- In the Turing model there is a **natural class** of problems $\#\mathbf{P}$ for **counting**, problems which contains many evaluation of graph polynomials.
However, $\#\mathbf{P}$ is **NOT CLOSED** under T-P-reductions.
- In the BSS model **no** corresponding class seems to **acomodate graph polynomials**.

Problems with hybrid complexity, II

- In 2013, T. Kotek, JAM, E. Ravve proposed a **new candidate**, the **class $\text{SOLEVAL}_{\mathcal{R}}$ of evaluations of SOL-polynomials**, the graph polynomials definable in Second Order Logic as described by T. Kotek, JAM, and B. Zilber (2008, 2011).
- The **main problem with hybrid complexity** is the **apparent incompatibility** of the two notions of polynomial reductions, $f_1 \leq_{T-P} f_2$ and $f_1 \leq_{BSS-P} f_2$ even in the case where f_1 and f_2 are both in $\#\mathbf{P}$.
- The number of 3-colorings of a graph, $\#\mathbf{3COL}$, and the number of acyclic orientations $\#\mathbf{ACYCLOR}$ are T-P-equivalent, and $\#\mathbf{P}$ -complete in the Turing model.
- In the BSS model we have $\#\mathbf{3COL} \leq_{BSS-P} \#\mathbf{ACYCLOR}$, but it is **open** whether $\#\mathbf{ACYCLOR} \leq_{BSS-P} \#\mathbf{3COL}$ holds.

The difficult point properties (DPP)

Difficult Point Property, I

Given a graph polynomial $P(G, \bar{X})$ in n indeterminates X_1, \dots, X_n we are interested in the set $\text{HARD}_{BSS}(P)$.

- (i) We say that P has the **weak difficult point property (WDPP)** if $\text{HARD}_{BSS}(P) \neq \emptyset$ then there is a quasi-algebraic subset $D \subset \mathbb{C}^n$ of co-dimension $\leq n - 1$ such that $\mathbb{C}^n - D \subseteq \text{HARD}_{BSS}(P)$.
- (ii) We say that P has the **strong difficult point property (SDPP)** if $\text{HARD}_{BSS}(P) \neq \emptyset$ then there is a quasi-algebraic subset $D \subset \mathbb{C}^n$ of co-dimension $\leq n - 1$ such that $\mathbb{C}^n - D = \text{HARD}_{BSS}(P) \neq \emptyset$ and $D = \text{EASY}_{BSS}(P)$.

In both cases $\text{EASY}_{BSS}(P)$ is of dimension $\leq n - 1$, and for almost all points $\bar{a} \in \mathbb{C}^n$ the evaluation of $P(-, \bar{a})$ is BSS-NP-hard.

$\chi(G; \lambda)$ and $T(G; X, Y)$ both have the SDPP.

Difficult Point Property, II

We compare WDPP and SDPP to Dichtomy Properties.

- (i) We say that P has the **dichotomy property (DiP)** if $\text{HARD}_{BSS}(P) \cup \text{EASY}_{BSS}(P) = \mathbb{C}^n$.
Clearly, if $\mathbf{P}_{\mathbb{C}} \neq \mathbf{NP}_{\mathbb{C}}$, $\text{HARD}_{BSS}(P) \cap \text{EASY}_{BSS}(P) = \emptyset$.
- (ii) WDPP is **not** a dichotomy property, but **SDPP a dichotomy property**.
- (iii) The two versions of DPP have a **quantitative aspect**:

$\text{EASY}_{BSS}(P)$ is small.

Graph polynomials with the DPP, I

SDPP: The Tutte polynomial (our paradigm).

SDPP: the **cover polynomial** $C(G, x, y)$ introduced by Chung and Graham (1995)
by [Bläser, Dell 2007](#), [Bläser, Dell, Fouz 2011](#)

SDPP: the bivariate **matching polynomial** for multigraphs,
by [Averbouch and JAM, 2007](#)

WDPP: the **Bollobás-Riordan polynomial**, generalizing the Tutte polynomial and introduced by Bollobás and Riordan (1999),
by [Bläser, Dell and JAM 2008, 2010](#).

WDPP: the **interlace polynomial** (aka Martin polynomial) introduced by Martin (1977) and independently by Arratia, Bollobás and Sorkin (2000),
by [Bläser and Hoffmann, 2007, 2008](#)

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Partition functions as graph polynomials

- Let $A \in \mathbb{C}^{n \times n}$ a **symmetric** and G be a graph. Let

$$Z_A(G) = \sum_{\sigma: V(G) \rightarrow [n]} \prod_{(v,w) \in E(G)} A_{\sigma(v), \sigma(w)}$$

Z_A is called a partition function.

- Let \mathbf{X} be the matrix $(X_{i,j})_{i,j \leq n}$ of indeterminates. Then $Z_{\mathbf{X}}$ is a **graph polynomial in n^2 indeterminates**, Z_A is an **evaluation** of $Z_{\mathbf{X}}$, and $Z_{\mathbf{X}}$ is **MSOL-definable**.

Partition functions have the SDPP

- J. Cai, X. Chen and P. Lu (2010),
building on A. Bulatov and M. Grohe (2005),
proved a dichotomy theorem for $Z_{\mathcal{X}}$ where $\mathcal{R} = \mathbb{C}$.
- Analyzing their proofs reveals:
 $Z_{\mathcal{X}}$ satisfies the SDPP for $\mathcal{R} = \mathbb{C}$.
- There are various generalizations of this to Hermitian matrices,
M. Thurley (2009),
and beyond.

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The DPP conjectures for graph polynomials definable in SOL or MSOL, I

The graph polynomials discussed in the literature all are definable in the formalism of **SOL-definable** graph polynomials.

Actually, **many** of the prominent graph polynomials are **MSOL-definable** using an **ordering on the vertices or edges**.

Among them the chromatic polynomial, the Tutte polynomials, the matching polynomials, etc.

Here we only need these definability criterion to **formulate our conjectures**.

Details can be found in

- J.A. Makowsky,
From a Zoo to a Zoology: Towards a general theory of graph polynomials,
Theory of Computing Systems, vol. 43 (2008), pp. 542-562.
- T. Kotek, J.A. Makowsky and B. Zilber,
On counting generalized colorings
Contemporary Mathematics, vol. 558 (2011), pp. 207-242

The DPP conjectures for graph polynomials definable in SOL or MSOL II

Let P be an SOL-definable graph polynomial in n indeterminates.

Assume that for some $\bar{a} \in \mathbb{C}^n$ evaluation of $P(-, \bar{a})$ is BSS-NP-hard over \mathbb{C} .

Weak DPP Conjecture: Then P has the WDPP.

Strong DPP Conjecture: Then P has the SDPP.

DPP for univariate graph polynomials, I

In

J.A. Makowsky and T. Kotek and E.V. Ravve,
A Computational Framework for the Study of
Partition Functions and Graph Polynomials,
Proceedings of the 12th Asian Logic Conference '11, (2013), pp. 210-230

we (frivolously) conjectured that,
for a **very large class** of graph polynomials,
some form of DPP would hold.

It turns out we were overreaching.

We took the **very large class** to be
all SOL-definable graph polynomials.

DPP for univariate graph polynomials, II

We now discuss this for **univariate** graph polynomials:

What we really had in mind was to

analyze the possible distribution

of the evaluation points of graph polynomials

which are **easy**,

i.e in **FP** or in **FP** _{\mathcal{R}} for $\mathcal{R} = \mathbb{R}$ or $\mathcal{R} = \mathbb{C}$

DPP for univariate graph polynomials, III

Let $P(G; X)$ be a univariate graph polynomial.

To analyze the situation one may need the following:

- (i) Find a point $a \in \mathbb{N}$ for which $P(-; a) \in \#\mathbf{P}$ and is $\#\mathbf{P}$ -complete.
- (ii) Find a way apply a generalization of **Linial's trick**.

When Can we prove the same for generalized univariate graph polynomials?

- Proper edge colorings and total (vertex and edge) colorings;
- Connected components colorings.
- Convex colorings.
- Complete colorings and harmonious colorings.
- $mcc(t)$ -colorings.
- etc.

? ? ? ? ?

Proper edge colorings $\chi_{edge}(G; X)$, I

Surprisingly, the complexity of counting proper edge colorings was proven $\#\mathbf{P}$ -hard only recently:

Theorem: (J. Y. Cai, H. Guo, T. Williams, 2014):

- $\#\text{-EdgeColoring}$ is $\#\mathbf{P}$ -hard over planar r -regular graphs for all $k \geq r \geq 3$.
- It is trivially tractable when $k \geq r \geq 3$ does not hold.

J. Y. Cai, H. Guo, T. Williams

The complexity of counting edge colorings and a dichotomy

for some higher domain Holant problems,

FOCS 2014 (full paper on arXiv <http://arxiv.org/pdf/1404.4020.pdf>, 75 pages)

Problem: Find an elementary proof of the complexity result.

Proper edge colorings $\chi_{edge}(G; X)$, II

Furthermore, we have

$$\chi_{edge}(G \boxtimes K_2; X + |V(G)| + 1) = \chi_{edge}(G; X) \cdot (|V(G)| + 1)!$$

This gives us that **SDPP** holds.

The same holds for **Total (vertex and edge) colorings**.

Connected components

Here we look at colorings where neighboring vertices must have the same color:

$\chi_{connected}(G; k)$ is the number of these colorings with at most k colors.

- $\chi_{connected}(G; m) = m^{k(G)}$ where $k(G)$ is the number of connected components of G .
- Clearly, $\chi_{connected}(G; X)$ is easily computable for all $X = a$ with $a \in \mathbb{R}$ or any other field.

This gives us that **SDPP** holds in a trivial way (as there are no difficult points).

Convex colorings

Joint work with A. Goodall and S. Noble

Recall: A convex (vertex) coloring with k colors is **convex** if every monochromatic set of vertices induces a **connected** graph.

Theorem:

- The problem of counting the number of colorings of the vertices of a graph with at most two colours, such that the color classes induce connected subgraphs is $\#\mathbf{P}$ -complete.

A. Goodall and S. Noble, 2008 (<http://arxiv.org/pdf/1404.4020.pdf>)

- $\chi_{convex}(G \sqcup K_1; X + 1) = X \cdot \chi_{convex}(G; X)$
- Computing $\chi_{convex}(G; 0)$ and $\chi_{convex}(G; 1)$ is easy.

This gives us that **SDPP** holds.

Note that, for $\chi_{connected}(G; k)$, where each color class is a connected component of G , we have $\chi_{connected}(G; k) = \binom{X}{k(G)}$, which is easy to compute.

Complete and harmonious colorings

Joint work with T. Kotek

Recall that a coloring is

- **complete** if every pair of colors occurs along some edge.
- **harmonious** if every pair of colors occurs at most once along some edge.
- $\chi_{complete}(G; k)$ is not a polynomial in k .

The exact complexity for fixed k seemingly is open.....

Harmonious colorings, continued.

Proposition: For every $k \in \mathbb{N}$ $\chi_{\text{harm}}(-; k)$ is easy to compute for $k \in \mathbb{N}$, because there are only finitely many graphs without isolated vertices which admit a harmonious coloring with k -colors.

However, this is **not uniform**: For each k a different polynomial time Turing machine is used.

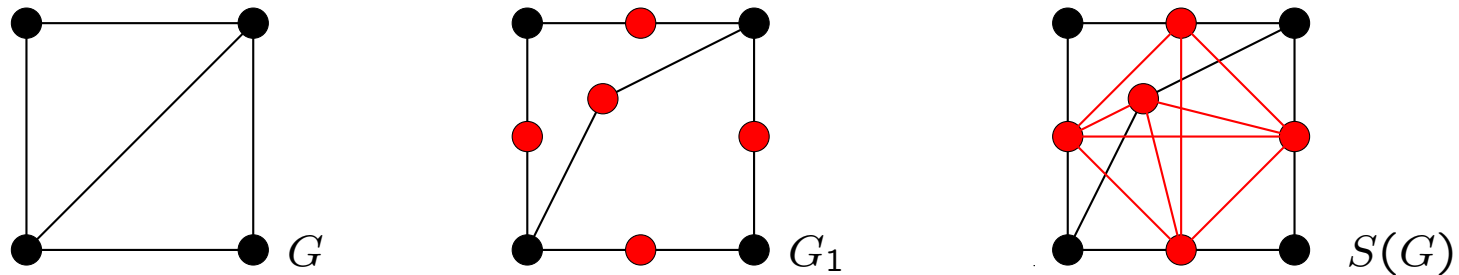
Theorem: For each $x \in \mathbb{C} - \mathbb{N}$ the evaluation of $\chi_{\text{harm}}(G; x)$ is $\#\text{P}$ -hard.

This gives us that **SDPP does not** hold for **harmonious** colorings.

[Skip proof](#)

Harmonious colorings, proof, I

We show that for each $x \in \mathbb{C} - \mathbb{N}$ the evaluation of $\chi_{harm}(G; x)$ is $\#\mathbf{P}$ -hard.



We add a **red** vertex on each edge of G (making two **black** edges out of it) and then add **red** edges such that the **red** vertices form a clique.

First we note that

$$\chi_{har}(S(G); k + e) = \chi(G; k) \cdot \binom{k + e}{e} e!$$

where $e = |E(G)|$ and $\chi(G; k)$ is the chromatic polynomial.

Harmonious colorings, proof, II

- Now for $k = a$ we have

$$\frac{\chi_{har}(S(G); a)}{\binom{a}{e} e!} = \chi(G; a - e)$$

- It remains to be shown that

$$\chi(G; a - e)$$

is $\#P$ -hard for every $a \in \mathbb{C} - \mathbb{N}$.

- We use **Linial's Trick**:

Let $v = |V(G)|$ and $|E(G \boxtimes K_1)| = e + v$:

$$\chi(G \boxtimes K_1; a - (e + v) + 1) = (a - (e + v) + 1) \cdot \chi(G, a - (e + v))$$

Which can be used for every $a \in \mathbb{C} - \mathbb{N}$.

Harmonious colorings, analysis

- It was shown by T. Kotek and JAM (CSL-2012), that $\chi_{har}(G; k)$ is not MSOL-definable.
- There are infinitely many easy points.
- The easy points form a discrete subset of \mathbb{C} .
- The easy points are exactly \mathbb{N} .

How shall we formulate a new version of DPP?

For univariate generalized chromatic polynomials
the set of easy points is either
(a) \mathbb{C} , or (b) \mathbb{N} , or (c) a finite subset of \mathbb{N} .

$mcc(t)$ -colorings

Joint work with Miki Hermann

Let $t \in \mathbb{N}$.

Recall that a coloring $f : V(G) \rightarrow [k]$ is an $mcc(t)$ -**coloring** with k colors, if the connected components of each color class have size at most t .

Let $\chi_{mcc(t)}(G; k)$ be the corresponding graph polynomial.

Theorem: Computing $\chi_{mcc(t)}(G; 2)$ is $\#\mathbf{P}$ -hard.

Proof: Reduction to $\#\mathbf{NAE3SAT}$.

$\#\mathbf{NAE3SAT}$ is $\#\mathbf{P}$ -complete by

Creignou, Nadia, and Miki Hermann.

"Complexity of generalized satisfiability counting problems."

Information and Computation 125.1 (1996): 1-12.

We don't know how to use a version of Linial's Trick.

Open Problem: Is the set of easy points finite ?

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More generalized chromatic polynomials

Let $f : V(G) \rightarrow [k]$ be a coloring of the vertices of $G = (V(G), E(G))$.

- (i) f is **t -improper** if for every $i \in [k]$ the counter-image $[f^{-1}(i)]$ induces a graph of maximal degree t .
- (ii) f is **H -free** if for every $i \in [k]$ the counter-image $[f^{-1}(i)]$ induces an H -free graph.
- (iii) f is **acyclic** if for every $i, j \in [k]$ the union $[f^{-1}(i)] \cup [f^{-1}(j)]$ induces an acyclic graph.

By Kotek, JAM, Zilber (2008), for all the above properties, counting the number of colorings is a polynomial in k .

More graph polynomials with the DPP

T. Kotek and JAM (2011) have shown

SDPP: The graph polynomial for t -improper colorings (for multigraphs).

SDPP: The bivariate chromatic polynomial introduced by Döhmen, Pönitz and Tittman in 2003.

WDPP: The graph polynomial for acyclic colorings.

C. Hoffmann's PhD thesis (written under M. Bläser, 2010) contains a general **sufficient criterion** which allows to establish the WDPP for a wide class of **(mostly non-prominent)** graph polynomials.

A good test problem: H -free colorings, I

We look at the generalized chromatic polynomial $\chi_{H\text{-free}}(G; k)$, which, for $k \in \mathbb{N}$ counts the number of H -free colorings of G .

- For $H = K_2$, $\chi_{H\text{-free}}(G; k) = \chi(G; k)$, and we have the SDPP.
- For $H = K_3$, $\chi_{H\text{-free}}(G; k)$ counts the triangle free-colorings.

A good test problem: H -free colorings, II

- From [ABCM98] it follows that $\chi_{H\text{-free}}(G; k)$ is #P-hard for every $k \geq 3$ and H of size at least 2.

D. Achlioptas, J. Brown, D. Corneil, and M. Molloy. The existence of uniquely H -colourable graphs. *Discrete Mathematics*, 179(1-3):1–11, 1998.

- In [Achlioptas97] it is shown that computing $\chi_{H\text{-free}}(G; 2)$ is NP-hard for every H of size at most 2.

D. Achlioptas. The complexity of H -free colourability. *DMATH: Discrete Mathematics*, 165, 1997.

- **Characterize H for which $\chi_{H\text{-free}}(G; k)$ satisfies the SDPP (WDPP).**

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What did we learn ?

- There are more things in heaven and earth, Horatio,
Than are dreamt of in your philosophy.
- Hamlet (1.5.167-8), Hamlet to Horatio
- There are more graph polynomials in heaven and earth,
George David Birkhoff,
Than are dreamt of in your mathematics.
- **What we don't understand:**
How are the difficulties of different evaluations related?

And the problems ?

- Study the complexity of generalized chromatic polynomials.
- Study the complexity of graph polynomials defined as generating functions

$$\sum_{A \subseteq V(G)} X^{|A|}$$

where $G[A] \in \mathcal{P}$

$G[A]$ is the induced subgraph generated by A in G , and \mathcal{P} is any graph property.

- Find criteria on graph polynomials which imply versions of DPP

Thank you for your attention !
