

Connection Matrices and Definability of Graph Invariants

Johann A. Makowsky

Faculty of Computer Science,
Technion - Israel Institute of Technology,
Haifa, Israel

<http://www.cs.technion.ac.il/~janos>
e-mail: janos@cs.technion.ac.il

Reporting also recent work by

M. Freedman, L. Lovász, A. Schrijver and B. Szegedy

Based on joint work with B. Godlin and T. Kotek

Three Lectures on Connection Matrices

- Lecture 1: Definability of graph properties and graph parameters
- Lecture 2: Characterizing partition functions
- Lecture 3: Definability of graph polynomials

Lecture 1: Overview

- Tame Logics
- Numeric graph invariants: Properties and guiding examples
- Non-definability via Complexity Theory
- Typical properties of graph parameters
- Connection matrices
- More connection matrices Parametrized numeric graph invariants and graph polynomials
- MSOL-definable graph polynomials
- Definability and non-definability in MSOL of graph parameters

Logic

Logics

In this talk a logic \mathcal{L} is a fragment of **Second Order Logic SOL**.

Let \mathcal{L} be a subset of **SOL**. \mathcal{L} is a **fragment of SOL** if the following conditions hold.

- (i) For every finite relational vocabulary τ the set of $\mathcal{L}(\tau)$ formulas contains all the atomic τ -formulas and is closed under boolean operations and renaming of relation and constant symbols.
- (ii) \mathcal{L} is equipped with a notion of **quantifier rank** and we denote by $\mathcal{L}_q(\tau)$ the set of formulas of quantifier rank at most q . The quantifier rank is subadditive under substitution of subformulas,
- (iii) The set of formulas of $\mathcal{L}_q(\tau)$ with a fixed set of free variables is, up to logical equivalence, finite.
- (iv) Furthermore, if $\phi(x)$ is a formula of $\mathcal{L}_q(\tau)$ with x a free variable of \mathcal{L} , then there is a formula ψ logically equivalent to $\exists x\phi(x)$ in $\mathcal{L}_{q'}(\tau)$ with $q' \geq q + 1$.
- (v) A fragment of **SOL** is called **tame** if it is closed under scalar transductions.

Typical fragments

- First Order Logic **FOL**.
- Monadic Second Order Logic **MSOL**.
- Logics augmented by **modular counting quantifiers**: $D_{m,i}x\phi(x)$ which says that the numbers of elements satisfying ϕ equals i modulo m .
- **CFOL**, **CMSOL** denote the logics **FOL**, resp. **MSOL**, augmented by all the modular counting quantifiers.
- Logics augmented by **Lindström quantifiers**.
- Logics restricted a fixed finite set of **bound** or **free** variables.

Boolean and Numeric graph invariants
aka
Graph properties and Graph parameters

Graph properties (boolean graph invariants)

We denote by $G = (V(G), E(G))$ a graph, and by \mathcal{G} and \mathcal{G}_{simple} the class of finite (simple) graphs, respectively.

A **graph property** or **boolean graph invariant** is a function

$$f : \mathcal{G} \rightarrow \mathbb{Z}_2$$

which is invariant under graph isomorphism.

More traditionally, a graph property $P = P_f$ is a family of graphs closed under isomorphisms given by $P_f = \{G : f(G) = 1\}$.

- (i) P is **hereditary**, if it is closed under induced subgraphs.
- (ii) P is **monotone**, if it is closed under (not necessarily induced) subgraphs.
- (iii) P is **definable** in some logic \mathcal{L} if there is a formula $\phi \in \mathcal{L}$ such that $P = \{G : G \models \phi\}$.
- (iv) **Regular graphs of fixed degree d** are definable in First order Logic **FOL**.
- (v) **Connectivity** and **planarity** are definable in Monadic Second Order Logic **MSOL**.

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Numeric graph invariants (graph parameters)

We denote by $G = (V(G), E(G))$ a graph, and by \mathcal{G} and \mathcal{G}_{simple} the class of finite (simple) graphs, respectively.

A **numeric graph invariant** or **graph parameter** is a function

$$f : \mathcal{G} \rightarrow \mathbb{R}$$

which is invariant under graph isomorphism.

(i) Cardinalities: $|V(G)|$, $|E(G)|$

(ii) Counting configurations:

$k(G)$ the number of connected components,

$m_k(G)$ the number of k -matchings

(iii) Size of configurations:

$\omega(G)$ the clique number

$\chi(G)$ the chromatic number

(iv) Evaluations of graph polynomials:

$\chi(G, \lambda)$, the chromatic polynomial, at $\lambda = r$ for any $r \in \mathbb{R}$.

$T(G, X, Y)$, the Tutte polynomial, at $X = x$ and $Y = y$ with $(x, y) \in \mathbb{R}^2$.

Definability of numeric graph parameters, I

We first give examples where we use **small**, i.e., polynomial sized sums and products:

(i) The cardinality of V is **FOL**-definable by

$$\sum_{v \in V} 1$$

(ii) The number of connected components of a graph G , $k(G)$ is **MSOL**-definable by

$$\sum_{C \subseteq V: \text{component}(C)} 1$$

where $\text{component}(C)$ says that C is a connected component.

(iii) The graph polynomial $X^{k(G)}$ is **MSOL**-definable by

$$\prod_{c \in V: \text{first-in-comp}(c)} X$$

if we have a linear order in the vertices and $\text{first-in-comp}(c)$ says that c is a first element in a connected component.

Definability of numeric graph parameters, II

Now we give examples with possibly **large**, i.e., exponential sized sums:

(iv) The number of cliques in a graph is **MSOL**-definable by

$$\sum_{C \subseteq V: \text{clique}(C)} 1$$

where $\text{clique}(C)$ says that C induces a complete graph.

(v) Similarly “the number of maximal cliques” is **MSOL**-definable by

$$\sum_{C \subseteq V: \text{maxclique}(C)} 1$$

where $\text{maxclique}(C)$ says that C induces a maximal complete graph.

(vi) The clique number of G , $\omega(G)$ is **SOL**-definable by

$$\sum_{C \subseteq V: \text{largest-clique}(C)} 1$$

where $\text{largest-clique}(C)$ says that C induces a maximal complete graph of largest size.

Definability of numeric graph parameters, III

A numeric graph parameter is \mathcal{L} -definable if it can be defined by similar expressions using **large** and **small sums** and only **small products**.

Usually, **summation** is allowed over **second order variables**, whereas **products** are over **first order variables**.

How can we prove **definability** and **non-definability** of graph parameters in some logic \mathcal{L} ? In particular:

- How to prove that $k(G)$ is not **CFOL**-definable?
- How to prove that $\omega(G)$ is not **CMSOL**-definable?
- How to prove that the chromatic number $\chi(G)$ or the chromatic polynomial $\chi(G, X)$ is not **CMSOL**-definable?

Non-definability via complexity assumptions:

Harmonious colorings

A vertex coloring of a graph G with k colors is **harmonious** if it is **proper** and each pair of colors appears at most once along an edge.

The **harmonious index** of a graph G is the smallest k such that there is a harmonious coloring with k colors.

- J.E. Hopcroft and M.S. Krishnamoorthy studied harmonious colorings in 1983.
- B. Courcelle has shown that graph parameters (polynomials) definable in **CMSOL** can be **computed in polynomial** time for graphs of **tree-width at most k** .
- K. Edwards and C. McDiarmid showed that computing the harmonious index is **NP-hard even on trees**.
- So **assuming $P \neq NP$** , the harmonious index is **not CMSOL-definable**, because trees have tree-width 1.

Non-definability via complexity assumptions: Chromaticity

- B. Courcelle, J.A.M. and U. Rotics proved that graph parameters (polynomials) definable in **CMSOL** in the **language of graphs** can be **computed in polynomial** time for graphs of **clique-width at most k** .
- The **Exponential Time Hypothesis (ETH)** says that $3 - SAT$ cannot be solved in time $2^{o(n)}$. It was first formulated by R. Impagliazzo, R. Paturi and F. Zane in 2001.
- F. Fomin, P. Golovach, D. Lokshtanov and S. Saurabh proved that, **assuming that ETH** holds, the chromatic number $\chi(G)$ cannot be computed in polynomial time.
- Therefore, assuming **ETH**, the chromatic number and the chromatic polynomial are **not CMSOL-definable**.

There are many other non-definability results which can be obtained like this, for example graph parameters derived from **dominating sets** or the size of a **maximal cut**.

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Our goal is to prove non-definability
without complexity theoretic assumptions.

Typical properties of graph parameters

Multiplicative graph parameters

with respect to \sqcup

Let $G_1 \sqcup G_2$ denote the disjoint union of two graphs.

f is **multiplicative** if $f(G_1 \sqcup G_2) = f(G_1) \cdot f(G_2)$.

- (i) $|V(G)|, |E(G)|, k(G)$ are not multiplicative
- (ii) $\chi(G)$ and $\omega(G)$ are not multiplicative
- (iii) The number of perfect matchings $pm(G)$ is multiplicative and so is the generating matching polynomial $\sum_k m_k(G) X^k$.
Note that $m_k(G)$ is not multiplicative.
- (iv) The graph polynomials $\chi(G, \lambda)$ and $T(G, X, Y)$ are multiplicative.

Additive graph parameters

with respect to \sqcup

Let $G_1 \sqcup G_2$ denote the disjoint union of two graphs.

f is **additive** if $f(G_1 \sqcup G_2) = f(G_1) + f(G_2)$.

- (i) $|V(G)|, |E(G)|$ are additive.
- (ii) $k(G)$ are additive
Let $b(G)$ be the number of 2-connected components of G .
 $b(G)$ is additive.
- (iii) $\chi(G)$ and $\omega(G)$ are not additive
- (iv) If f is additive and $r \in \mathbb{R}$, then r^f is multiplicative.

Maximizing and minimizing graph parameters

with respect to \sqcup

Let $G_1 \sqcup G_2$ denote the disjoint union of two graphs.

f is **maximizing** if $f(G_1 \sqcup G_2) = \max\{f(G_1), f(G_2)\}$.

f is **minimizing** if $f(G_1 \sqcup G_2) = \min\{f(G_1), f(G_2)\}$.

- (i) The various chromatic numbers $\chi(G)$, $\chi_e(G)$, $\chi_t(G)$ are maximizing.
- (ii) The size of the maximal clique $\omega(G)$ and the maximal degree $\Delta(G)$ are maximizing.
- (iii) The tree-width $tw(G)$ and the clique-width $cw(G)$ of a graph are maximizing.
- (iv) The minimum degree $\delta(G)$, the girth $g(G)$ are minimizing.

The girth is the minimum length of a cycle in G .

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The connection matrix of a graph parameter
with respect to the disjoint union \sqcup

Connection matrix $M(f, \sqcup)$.

Let G_i be an enumeration of all finite graphs (up to isomorphism).

The **(full) connection matrix** $M(f, \sqcup) = m_{i,j}(f, \sqcup)$ is defined by

$$m_{i,j}(f, \sqcup) = f(G_i \sqcup G_j)$$

The **rank** of $M(f, \sqcup)$ is denoted by $r(f, \sqcup)$.

We shall often look at various infinite submatrices of the full connection matrix.

Examples: Check with $|V(G)|$ and $2^{|V(G)|}$.

Computing $r(f, \sqcup)$

Proposition:

- (i) If f is multiplicative, $r(f, \sqcup) = 1$.
- (ii) If f is additive, $r(f, \sqcup) = 2$.
- (iii) If f is maximizing or minimizing, $r(f, \sqcup)$ is infinite.
- (iv) For the average degree $d(G)$ of a graph, $r(d, \sqcup)$ is infinite.

Proof: The first three statements are easy.

For $f = d(G)$ we have

$$M(d, \sqcup) = 2 \frac{|E_1| + |E_2|}{|V_1| + |V_2|}.$$

This contains, for graphs with a fixed number e of edges, the Cauchy matrix $(\frac{2e}{i+j})$, hence $r(d, \sqcup)$ is infinite. \square .

Characterizing multiplicative graph parameters

M. Freedman, L. Lovász and A. Schrijver, 2007

Theorem: ([FLS] Proposition 2.1.)

Assume $f(G) \neq 0$ for some graph G .

f is multiplicative iff $M(f, \sqcup)$ has rank 1 and is positive semi-definite.

Recall: A finite square matrix M over an ordered field is **positive semi-definite** if for all vectors \bar{x} we have $\bar{x}M\bar{x}^{tr} \geq 0$. An infinite matrix is positive semi-definite, if every finite principal submatrix is positive semi-definite.

General Connection Matrices

General Connection Matrices: I

Let \mathcal{C} be a class possibly **labeled graphs, hyper-graphs** or τ -structures.

Let \square be a binary operation define on \mathcal{C} .

Let G_i be an enumeration of all (labeled) finite graphs

Let f be graph parameter.

The (full) connection matrix $M(f, \square)$ is defined by

$$M(f, \square)_{i,j} = f(G_i \square G_j)$$

and is called the **Full Connection Matrix of f for \square on \mathcal{C}** ,

or just a **connection matrix**.

We shall often look at infinite submatrices of $M(f, \square)$.

\mathcal{L} -smooth operations.

Let \mathcal{L} be a logic.

We say that two graphs G, H are (\mathcal{L}, q) -equivalent, and write $G \sim_{\mathcal{L}}^q H$, if G and H satisfy the same \mathcal{L} -sentences of quantifier rank q .

We say that \square is \mathcal{L} -smooth, if whenever we have

$$G_i \sim_{\mathcal{L}}^q H_i, i = 0, 1$$

then

$$G_0 \square G_1 \sim_{\mathcal{L}}^q H_0 \square H_1$$

This definition can be adapted to k -ary operations for $k \geq 1$.

Proving that an operation \square is \mathcal{L} -smooth may be difficult.

For **FOL** this can be achieved using

Ehrenfeucht-Fraïssé games also known as **pebble games**.

Another way of establishing smoothness is via the **Feferman-Vaught theorem**.

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Examples of \mathcal{L} -smooth operations.

- (i) Quantifier-free **scalar** transductions are both **FOL** and **MSOL**-smooth.
- (ii) Quantifier-free **vectorized** transductions are **FOL** but not **MSOL**-smooth.
- (iii) The **cartesian product** is **FOL**-smooth but not **MSOL**-smooth.
This was shown by **A. Mostowski in 1952**.
- (iv) The **(rich) disjoint union** is both **FOL** and **MSOL**-smooth.
The **rich** disjoint union has two additional unary predicates to distinguish the universes.
For **FOL** this was shown by **E. Beth in 1952**.
For **MSOL** this is due to **H. Läuchli, 1966**, using **Ehrenfeucht-Fraïssé games**.
- (v) **Adding modular counting quantifiers preserves smoothness**.
For **CMSOL** and the **disjoint union** this is due to **B. Courcelle, 1990**.
For **CFOL** and the **red product** this is due to **T. Kotek and J.A.M., 2012**.

The Finite Rank Theorem

THEOREM (Godlin, Kotek, Makowsky 2008):

Let f be a **numeric parameter** or **polynomial** for τ -structures definable in \mathcal{L} and taking values in an integral domain \mathcal{R} .

Let \square be an \mathcal{L} -smooth operation.

Then the connection matrix $M(f, \square)$ has **finite rank** over \mathcal{R} .

The **Proof** uses a Feferman-Vaught-type theorem for graph polynomials, due to [B. Courcelle, J.A.M. and U. Rotics, 2000](#).

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Applications of the Finite Rank Theorem, I

Disjoint unions

The following graph parameters are or not CMSOL-definable because they are maximizing (minimizing) for the disjoint union.

- $\omega(G)$, the **clique number** and $\alpha(G)$, the **independence number** of G .
- The **chromatic number** $\chi(G)$ and the **chromatic index** $\chi_e(G)$.
- The **degrees** $\delta(G)$ (minimal), $\Delta(G)$ (maximal)

The same holds for the average degree $d(G)$, but here we use the fact that the Cauchy matrix growing rank.

Applications of the Finite Rank Theorem, I

Products combined with translation schemes

The transduction

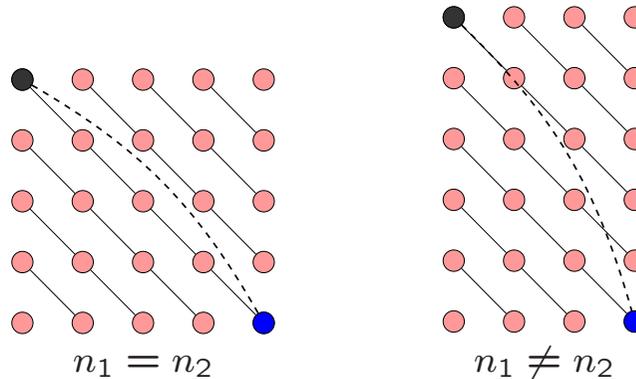
$$\Phi_F((v_1, v_2), (u_1, u_2)) = (E_1(v_1, u_1) \wedge E_2(v_2, u_2)) \vee ((v_1, v_2), (u_1, u_2)) = ((start_1, start_2), (end_1, end_2))$$

transforms the cartesian product of two **directed paths** $P_{n_i}^i = (V_i, E_i, start_i, end_i)$ of length n_i with the two constants $start_i$ and end_i , $i = 1, 2$ into an undirected graph with at most one cycle.

The input graphs look like this:



The result of the transduction is:



THEOREM: Graphs without cycles of odd (even) length
are not **CFOL**-definable **even in the presence of a linear order**.

Corollary: Not definable in **CFOL** with order are

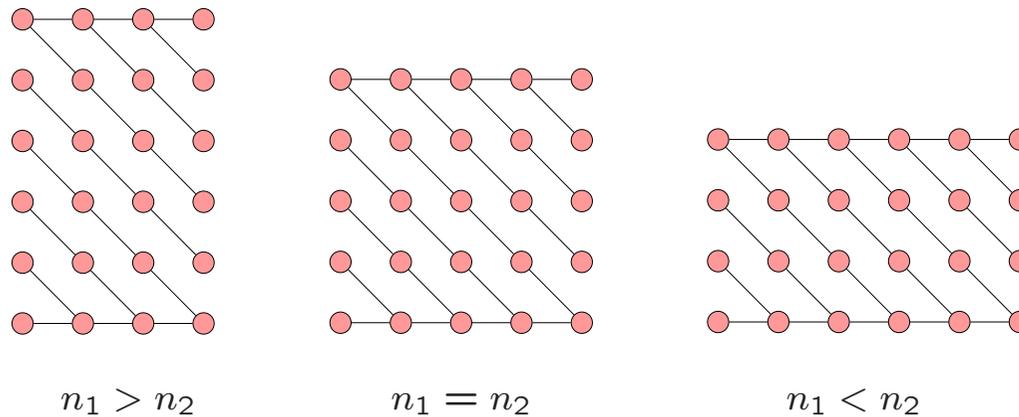
- (i) Forests, bipartite graphs, chordal graphs, perfect graphs
- (ii) interval graphs (cycles are not interval graphs)
- (iii) Block graphs (every biconnected component is a clique)
- (iv) Parity graphs (any two induced paths joining the same pair of vertices have the same parity)

THEOREM: Trees or connected graphs are not **CFOL**-definable even in the presence of linear order.

The transduction

$$\begin{aligned} \Phi_T((v_1, v_2), (u_1, u_2)) = & (E_1(v_1, u_1) \wedge E_2(v_2, u_2)) \vee \\ & (v_1 = u_1 = \text{start}_1 \wedge E(v_2, u_2)) \vee \\ & (v_1 = u_1 = \text{end}_1 \wedge E(v_2, u_2)), \end{aligned}$$

combined with Φ_{sym} transforms the cartesian product of two **directed paths** into the structures below:



Tree: $n_1 = n_2$. Connected: $n_1 \geq n_2$

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k -graphs and k -sums

A k -graph is a graph $G = (V(G), E(G))$

with k distinct vertices labeled with $0, 1, \dots, k - 1$.

Given two k -graphs G_1, G_2 we define the k -sum

$$G_1 \sqcup_k G_2$$

as the disjoint union of G_1 and G_2 where we

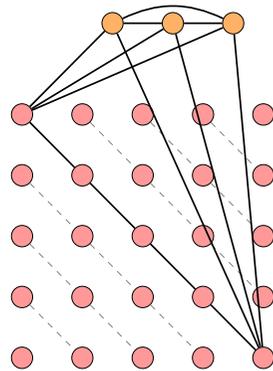
identify correspondingly labeled vertices.

Theorem: The k -sum is smooth for FOL, CFOL, MSOL and CMSOL.

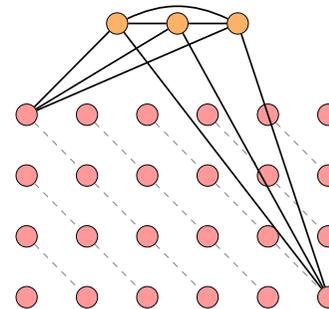
THEOREM: Planar graphs are not **CFOL**-definable even on ordered connected graphs

For our next connection matrix we use the 2-sum of the following two 2-graphs:

- the 2-graph (G, a, b) obtained from from K_5 by choosing two vertices a and b and removing the edge between them
- the cartesian product of the two graphs $P_{n_1}^1$ and $P_{n_2}^2$:



$$n_1 = n_2$$



$$n_1 \neq n_2$$

The result of this construction has a clique of size 5 as a minor iff $n_1 = n_2$.

It can never have a $K_{3,3}$ as a minor.

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A modification

If we modify the above construction by taking K_3 instead of K_5 and making $(start_1, start_2)$ and (end_1, end_2) adjacent, we get

Proposition: The following classes of graphs are not **CFOL**-definable even on ordered connected graphs.

- (i) Cactus graphs, i.e. graphs in which any two cycles have at most one vertex in common.
- (ii) Pseudo-forests, i.e. graphs in which every connected components has at most one cycle.

Non-definability in CMSOL for graphs $G = (V, E)$

Using the join operation

The **join operation** of graphs $G = (V, E)$, where E is the **edge relation**, is defined by

$$(V_1, E_1) \bowtie (V_2, E_2) = (V_1 \sqcup V_2, E_1 \sqcup E_2 \cup \{(v_1, v_2) : v_1 \in V_1, v_2 \in V_2\})$$

This is a quantifier free transduction of the disjoint union, hence smooth for CMSOL.

Consider the connection matrix where the rows and columns are labeled by the graphs on n vertices but without edges E_n .

The graph $E_i \bowtie E_j = K_{i,j}$ is

- hamiltonian iff $i = j$;
- has a perfect matching iff $i = j$;
- is a cage graph (a regular graph with as few vertices as possible for its girth) iff $i = j$;
- is a well-covered graph (every minimal vertex cover has the same size as any other minimal vertex cover) iff $i = j$.

All of these connection matrices have infinite rank.

Proposition: None of the properties above are CMSOL-definable as graphs even in the presence of an order.

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CMSOL for hyper-graphs $G = (V, E; R)$

A hyper-graphs $G = (V, E; R)$ has vertices V and edges E and an incidence relation R between the two.

- CMSOL for hyper-graphs $G = (V, E; R)$ allows quantification over edge sets.
- For the language of hypergraphs the join operation is **neither MSOL- nor CMSOL-smooth**, since it increases the number of edges.
- Note also that hamiltonicity and having a perfect matching are both definable in CMSOL in the language of hypergraphs.

In the many papers of B. Courcelle, MSOL on graphs is called MSOL₁ and for hyper-graphs it is called MSOL₂.

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Non-definability in CMSOL for hyper-graphs $G = (V, E; R)$

Using the disjoint union

Using the connection submatrices of the disjoint union we still get:

- Regular: $K_i \sqcup K_j$ is regular iff $i = j$;
- A generalization of regular graphs are *bidegree* graphs, i.e., graphs where every vertex has one of two possible degrees. $K_i \sqcup (K_j \sqcup K_1)$ is a bidegree graph iff $i = j$.
- The average degree of $K_i \sqcup E_j$ is at most $\frac{|V|}{2}$ iff $i = j$;
- A digraph is *aperiodic* if the common denominator of the lengths of all cycles in the graph is 1. We denote by C_i^d the directed cycle with i vertices. For prime numbers p, q the digraphs $C_p \sqcup C_q$ is aperiodic iff $p \neq q$.
- A graph is *asymmetric (or rigid)* if it has no non-trivial automorphisms. It was shown by P. Erdős and A. Rényi (1963) that almost all finite graphs are asymmetric. So there is an infinite set $I \subseteq \mathbb{N}$ such that for $i \in I$ there is an asymmetric graph R_i of cardinality i . $R_i \sqcup R_j$ is asymmetric iff $i \neq j$.

Proposition: None of the properties above are CMSOL-definable as hyper-graphs even in the presence of an order.

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Proving non-definability with connection matrices: Merits

The **advantages** of the Finite Rank Theorem for tame \mathcal{L} in proving that a property is not definable in \mathcal{L} are the following:

- (i) It suffices to prove that certain binary operations on graphs (\mathcal{T} -structures) are \mathcal{L} -smooth operation.
- (ii) Once the \mathcal{L} -smoothness of a binary operation has been established, proofs of non-definability become surprisingly simple and transparent.
One of the most striking examples is the fact that asymmetric (rigid) graphs are not definable in **CMSOL**.
- (iii) Many properties can be proven to be non-definable using the same or similar submatrices, i.e., matrices with the same row and column indices. This was well illustrated in the shown examples.

Proving non-definability with connection matrices: Limitations

The classical method of proving non-definability in **FO**L using pebble games is **complete** in the sense that a property is $\mathbf{FO}L(\tau)_q$ -definable iff the class of its models is closed under game equivalence of length q .

Using pebble games one proves easily that the class of structures without any relations of even cardinality, **EVEN**, is not **FO**L-definable.

However, one cannot prove that **EVEN** is not **FO**L-definable using **infinite rank connection matrices**, in the following sense:

Proposition: Let Φ a quantifierfree transduction between τ -structures and let \square_Φ be the binary operation on τ -structures:

$$\square_\Phi(\mathfrak{A}, \mathfrak{B}) = \Phi^*(\mathfrak{A} \sqcup_{rich} \mathfrak{B})$$

Then the connection matrix $M(\square_\Phi, \mathbf{EVEN})$ satisfies:

- (i) There is a finite partition $\{U_1, \dots, U_k\}$ of the (finite) τ -structures such that the submatrices obtained from restricting $M(\square_\Phi, \psi)$ to $M(\mathbf{EVEN}, \square_\Phi)^{[U_i, U_j]}$ have constant entries.
- (ii) In particular, the infinite matrix $M(\mathbf{EVEN}, \square_\Phi)$ has finite rank over any field \mathcal{F} .
- (iii) $M(\mathbf{EVEN}, \square_\Phi)$ has an infinite submatrix of rank at most 1.

Note that **EVEN** is trivially definable in **CFOL**.

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Lecture 2

Counting weighted homomorphisms

aka

Partition functions

aka

Vertex coloring models

Lecture 2: Overview

- Counting weighted homomorphisms
- The original connection matrices
- Representability
- Representation theorems

Counting weighted homomorphisms

Let $H = (V(H), E(H))$ be a fixed graph, possibly with loops.

Let $\alpha : V(H) \rightarrow \mathbb{R}^+$ and $\beta : E(H) \rightarrow \mathbb{R}$ be weight functions of vertices and edges respectively.

Let $h : G \rightarrow H$ be a homomorphism.

Define weights of h by

$$\alpha_h = \prod_{u \in V(G)} \alpha(h(u)) \quad \text{and} \quad \beta_h = \prod_{u,v \in E(G)} \beta(h(u), h(v))$$

Finally, we sum over all homomorphisms

$$Z_{H,\alpha,\beta}(G) = \sum_{h:G \rightarrow H} \alpha_h \cdot \beta_h$$

$Z_{H,\alpha,\beta}(G)$ is often called a **partition function** or a **vertex coloring model**.

- $Z_{H,\alpha,\beta}(G)$ is multiplicative.
- For α, β constant = 1, $Z_{H,\alpha,\beta}(G)$ counts the number of homomorphisms.

Examples of partition functions

- For $H = K_m$, a clique with m vertices,

$$Z_{K_m,1,1}(G) = \chi(G, m)$$

which counts the number of proper m -colorings.

- For $H = L_1$, an isolated loop, $\alpha = \lambda$, $\beta = \mu$,

$$Z_{L_1,\lambda,\mu}(G) = \lambda^{|V(G)|} \cdot \mu^{|E(G)|}$$

- For $H = L_m$ consisting of m isolated loops, $\alpha = \lambda$, $\beta = \mu$,

$$Z_{L_m,\lambda,\mu}(G) = m^{k(G)} \cdot \lambda^{|V(G)|} \cdot \mu^{|E(G)|}$$

- For $H = K_1 \boxtimes L_1$ with vertices v, ℓ respectively, and $\alpha(v) = X$, $\alpha(\ell) = 1$, $\beta = 1$ we get

$$Z_{K_1 \boxtimes L_1, \alpha, \beta}(G) = \sum_i \text{ind}_i(G) \cdot X^i$$

where $\text{ind}_i(G)$ is the number of independent sets of size i in G .

k -connection matrices

The name [connection matrices](#) originates here.

M. Freedman, L. Lovász and A. Schrijver coined the term with k -unions in mind, thinking of [\$k\$ -connections](#).

k -graphs and their connection matrices

A k -graph is a graph $G = (V(G), E(G))$ with k distinct vertices labeled with $0, 1, \dots, k - 1$.

Let G_0, G_1, \dots be an enumeration of all k -graphs up to label preserving isomorphisms.

Given two k -graphs G_1, G_2 we define the k -sum $G_1 \sqcup_k G_2$ as the disjoint union of G_1 and G_2 where we identify correspondingly labeled vertices.

Given a numeric graph invariant f , we define the **k -connection matrix**

$$M(f, k) = m_{i,j}(f, k)$$

by

$$m_{i,j}(f, k) = f(G_i \sqcup_k G_j)$$

We denote by $r(f, k)$ the **rank of $M(f, k)$** .

Properties of k -connection matrices, I

Examples:

- (i) $M(\omega(G), k)$ has infinite rank.
- (ii) $M(|V(G)|, k)$ has rank 2 for every $k \geq 0$.
- (iii) $M(2^{|V(G)|}, k)$ has rank $r(2^{|V(G)|}, k) = 1$ for every $k \geq 0$.
- (iv) $M(2^{k(G)}, k)$ has rank $r(2^{k(G)}, k) = 2^k$ for every $k \geq 0$.

Proposition:([FLS] Proposition 2.2)

Let f be a multiplicative numeric graph invariant, and $k, \ell \geq 0$. Then

$$r(f, k + \ell) \geq r(f, k) \cdot r(f, \ell)$$

Properties of k -connection matrices, II

Let f be a graph parameter.

(i) f is k -additive if for all k -labeled graphs $G_1, G_2 \in \mathcal{G}_k$ we have

$$f(G_1 \sqcup_k G_2) = f(G_1) + f(G_2).$$

(ii) f is k -multiplicative if for all k -labeled graphs $G_1, G_2 \in \mathcal{G}_k$ we have

$$f(G_1 \sqcup_k G_2) = f(G_1) \cdot f(G_2).$$

(iii) f is k -maximizing if for all k -labeled graphs $G_1, G_2 \in \mathcal{G}_k$ we have

$$p(G_1 \sqcup G_2, \bar{X}) = \max\{p(G_1, \bar{X}), p(G_2, \bar{X})\},$$

and similarly for k -minimizing.

Properties of k -connection matrices, III

Proposition:

- (i) If f is k -multiplicative, $r(f, k) = 1$.
- (ii) If f is k -additive, $r(f, k) = 2$.
- (iii) If f is k -maximizing or k -minimizing, $r(f, k)$ is infinite.
- (iv) If $p(G, X)$ is a multiplicative (additive) graph polynomial, and $d_p(G)$ is its degree, then $d_p(G)$ is additive (resp. maximizing).

Properties of k -connection matrices, IV

Theorem:([FLS] Lemma 2.3 and [L2] Corollary 2.3)

For every weighted graph (H, α, β)

$$r(Z_{H,\alpha,\beta}(G), k) \leq |V(H)|^k$$

If (H, α, β) has no automorphisms and no twins, then

$$r(Z_{H,\alpha,\beta}(G), k) = |V(H)|^k$$

Definitions:

Automorphisms here are weight preserving.

Two vertices $u, v \in V(H)$ of (H, α, β) are **twins**

if for every $w \in V(H)$ we have that $\beta(u, w) = \beta(v, w)$.

Being twins does not depend on α .

File:fls

Properties of k -connection matrices, V

Theorem:([FLS] Lemma 2.3)

For every weighted graph (H, α, β)
the matrix $M(Z_{H, \alpha, \beta}(G), k)$ is positive semi-definite.

Examples:([FLS] Section 3)

- (i) Let $pm(G)$ denote the number of perfect matchings of G .
 $pm(G)$ is multiplicative and $r(pm, k) = 2^k$,
but $M(pm, 1)$ is not positive definite.
- (ii) For $\chi(-, \lambda)$, $\lambda \in \mathbb{Z}$ we have:
 $M(\chi(-, \lambda), k)$ is positive-semi-definite,
and $r(\chi(-, \lambda), k)$ is finite,
but exponentially bounded only for $\lambda \in \mathbb{Z}^+$,
otherwise it grows superexponentially.

Representation theorems

The FLS-representation theorem

We say that a numeric graph invariant is **hom-presentable** if there is a weighted graph (H, α, β) such that for every G

$$f(G) = Z_{H, \alpha, \beta}(G)$$

Examples:

- (i) $|V(G)|, |E(G)|, k(G)$ are not hom-presentable, but $2^{|V(G)|}, 2^{|E(G)|}, 2^{k(G)}$ are hom-presentable.
- (ii) $\chi(-, \lambda)$ is hom-presentable for every $\lambda \in \mathbb{Z}^+$, but the **choice of (H, α, β) depends on λ** .

Theorem: ([FLS] Theorem 2.4)

f is hom-presentable iff for every $k \in \mathbb{N}$

- (i) $M(f, k)$ is positive semi-definite, and
- (ii) $r(f, k) \leq q^k$ for some $q \in \mathbb{N}^+$.

Other representation theorems

There are generalizations:

- B. Szegedy [Sz] considers **edge coloring models** and connection matrices $S(f, k)$ based on identification of k unfinished edges.
- A. Schrijver [Schr-08, Schr-08a] unifies the proofs of [FLS] and [Sz] using further variations of connection matrices $S_i(f, k)$ with $i = 1, \dots, 10$ including also hyper-graphs and directed graphs.

In principle one can define connection matrices

$$M(f, \otimes_k)$$

for any binary operation \otimes_k on k -graphs.

Lecture 3:

Parametrized numeric graph invariants

and

graph polynomials

Lecture 3: Overview

- Parametrized graph parameters and graph polynomials
- The prominent graph polynomials:
 - Characteristic polynomial,
 - Tutte polynomial,
 - Cover polynomial
- Definability of graph polynomials
- Conclusions

Parametrized numeric graph invariants

A **parametrized numeric graph invariant** is a function

$$f : \mathcal{G} \times R \rightarrow \mathbb{R}$$

which is invariant under graph isomorphism.

Here R can be $\mathbb{N}, \mathbb{Z}, \mathbb{R}$ or any ring.

Examples:

- (i) $ind_k(G)$ the number of independent sets of size k .
- (ii) $ind(G, X) = \sum_i ind(G, i) \cdot X^i$, the independent set polynomial.
- (iii) The chromatic polynomial $\chi(G, \lambda)$.
- (iv) Any graph polynomial from the literature, like matching polynomials, Tutte polynomial, interlace polynomial, cover polynomial of directed graphs, etc.

Coding many graph parameters into a graph polynomial

A particular graph polynomial is considered

interesting

if it encodes many useful graph parameters.

The characteristic polynomial

Let $G = (V(G), E(G))$ be a graph.

The characteristic polynomial $P(G, X)$ is defined as the characteristic polynomial (in the sense of linear algebra) of the adjacency matrix A_G of G defined as

$$\det(X \cdot \mathbf{1} - A_G) = \sum_{i=0}^n c_i(G) \cdot X^{n-i}.$$

It is well known that

- (i) $n = |V(G)|$
- (ii) $-c_2(G) = |E(G)|$
- (iii) $-c_3(G)$ equals twice the number of triangles of G .
- (iv) The second largest zero $\lambda_2(G)$ of $P(G; X)$ gives a lower bound to the conductivity of G

The Tutte polynomial

The Tutte polynomial of G is defined as

$$T(G; X, Y) = \sum_{F \subseteq E(G)} (X - 1)^{r\langle E \rangle - r\langle F \rangle} (Y - 1)^{n\langle F \rangle}$$

where $k\langle F \rangle$ is the number of connected components of the **spanning subgraph defined by F** ,

$r\langle F \rangle = |V| - k\langle F \rangle$ is its rank

and $n\langle F \rangle = |F| - |V| + k\langle F \rangle$ is its nullity.

Evaluations of the Tutte polynomial

See D. Welsh, Complexity: Knots, colourings and counting, Cambridge, 1993, and M. Korn and I. Pak, Tilings of rectangles with T-tetrominoes, TCS 319, 2004

- (i) $T(G; 1, 1)$ is the number of spanning trees of G ,
- (ii) $T(G; 1, 2)$ is the number of connected spanning subgraphs of G ,
- (iii) $T(G; 2, 1)$ is the number of spanning forests of G ,
- (iv) $T(G; 2, 2)$ is the number of spanning subgraphs of G ,
- (v) $T(G; 1 - k, 0)$ is the number of proper k -vertex colorings of G ,
- (vi) $T(G; 2, 0)$ is the number of acyclic orientations of G ,
- (vii) $T(G; 0, -2)$ is the number of Eulerian orientations of G .
- (viii) $2 \cdot T(\text{Grid}_{4x,4y}; 3, 3)$ is the number of tilings of the $(4x \times 4y)$ - grid graph with T-tetrominoes

The cover polynomial

Chung and Graham, 1995 and D'Antona and Munarini, 2000

Let $D = (V, E)$ be a directed graph.

$C \subseteq E$ is a **path-cycle cover of G** if C is a subgraph with maximal in-degree ≤ 1 and maximal out-degree ≤ 1 and C is a vertex disjoint decomposition of E with $p(C)$ paths and $c(C)$ cycles.

The **(factorial) cover polynomial** is the polynomial

$$C(D, x, y) = \sum_C (x)_{p(C)} \cdot y^{c(C)}$$

The **(geometric) cover polynomial** is the polynomial

$$C_{geom}(D, x, y) = \sum_C (x)^{p(C)} \cdot y^{c(C)}$$

Here $(x)_n = x \cdot (x - 1) \cdot \dots \cdot (x - n + 1)$ is the falling factorial.

File:eval

Evaluations of the cover polynomial

- (i) $C(D, 0, 1)$ is the number of cycle covers of D , which is the permanent of the adjacency matrix of D .
- (ii) $C(D, 0, -1)$ is the determinant of the adjacency matrix of D .
- (iii) $C(D, 1, 0)$ is the number of hamiltonian paths of D .
- (iv) $C(D, x, 1)$ is the *factorial rook polynomial* of D .

Evaluations, coefficients and zeros of graph polynomials

How could one prove that a graph parameter f is

not coded

in a given graph polynomial from an infinite class of graph polynomials \mathcal{P} as

- an evaluation?
- a coefficient?
- a zero?

We will **again** use **connection matrices**!

Definability of graph polynomials
in Monadic Second Order Logic MSOL

Simple MSOL-definable graph polynomials

The graph polynomial $ind(G, X) = \sum_i ind(G, i) \cdot X^i$, can be written also as

$$ind(G, X) = \sum_{I \subseteq V(G)} \prod_{v \in I} X$$

where I ranges over all independent sets of G .

To be an independent set is definable by a formula of Monadic Second Order Logic (MSOL) $\phi(I)$.

A **simple MSOL-definable graph polynomial** $p(G, X)$ is a polynomial of the form

$$p(G, X) = \sum_{A \subseteq V(G): \phi(A)} \prod_{v \in A} X$$

where A ranges over all subsets of $V(G)$ satisfying $\phi(A)$ and $\phi(A)$ is a MSOL-formula.

General MSOL-definable graph polynomials

For the general case

- One allows several indeterminates X_1, \dots, X_t .
- One gives an inductive definition.
- One allows an ordering of the vertices.
- One requires the definition to be **invariant under the ordering**, i.e., different orderings still give the same polynomial.
- This also allows to define the modular counting quantifiers $C_{m,q}$ "there are, modulo q exactly m elements..."

The general case includes the Tutte polynomial, the cover polynomial, and **virtually all graph polynomials from the literature**.

Finiteness of $r(f, \square)$ for \mathcal{L} -smooth operations \square .

Finite Rank Theorem:([GKM])

Let $p(G, \bar{X})$ be a general \mathcal{L} -definable graph polynomial in t indeterminates, and $\bar{x} \in \mathbb{R}^t$.

For $f(G) = p(G, \bar{x})$ the rank $r(f, \square)$ is finite, provide \square is \mathcal{L} -smooth.

Proof: We use the **bilinear** version of the **Feferman-Vaught Theorem** for graph polynomials from [M] to estimate the $r(f, \square)$.

The estimates are very bad, and just suffice to establish finiteness of $r(f, \square)$, but they grow with multiple exponentials in k .

File:msol

Applications of the Finite Rank Theorem, I

Corollary:[GKM] The following numeric graph invariants f have $r(f, k) < \infty$:

- (i) The number of acyclic orientations
- (ii) The number of eulerian orientations

Proof: They are both instances of the Tutte polynomial.

Applications of the Finite Rank Theorem, II

Corollary:([GKM])

$\omega(G)$ is not an instance of any MSOL-definable graph polynomial, but is the degree of some MSOL-definable graph polynomial,

Proof: $\omega(G_1 \sqcup G_2) = \max\{\omega(G_1), \omega(G_2)\}$. So $r(\omega, 0) = \infty$.

$\omega(G)$ can be obtained as degree of the graph polynomial

$$\text{clique}(G, X) = \sum_i \text{clique}_i(G) X^i = \sum_{C \subseteq V} \prod_{v \in C} X$$

where $\text{clique}_i(G)$ is the number of cliques of size i , and C varies over all cliques of G .

Clearly, $\text{clique}(G, X)$ is a simple MSOL-definable graph polynomial. □

Applications of the Finite Rank Theorem, III

Corollary:([GKM])

- (i) If f satisfies $f(G_1 \sqcup G_2) = \max\{f(G_1), f(G_2)\}$, then f is **not an instance** of an MSOL-definable graph polynomial.
- (ii) If f satisfies $f(G_1 \sqcup G_2) = \min\{f(G_1), f(G_2)\}$, then f is **not an instance** of an MSOL-definable graph polynomial.

Applications of the Finite Rank Theorem, IV

Let $d(G)$ denote the **average degree** of G . We have

$$d(G) = \frac{1}{|V(G)|} \cdot \sum_{v \in V(G)} d_G(v),$$

where $d_G(v)$ denotes the degree of a vertex v of G .

Corollary:([GKM])

$d(G)$ is **not an instance** of an MSOL-definable graph polynomial.

Proof: For $f = d(G)$ we have

$$M(d, 0) = 2 \frac{|E_1| + |E_2|}{|V_1| + |V_2|}.$$

This contains, for graphs with a fixed number e of edges, the Cauchy matrix

$$\left(\frac{2e}{i+j} \right),$$

hence $r(d, 0)$ is infinite. □

File:msol

Three graph polynomials, I

Rainbow polynomial $\chi_{rainbow}(G, k)$ is the number of **path-rainbow connected k -colorings**, which are functions $c : E(G) \rightarrow [k]$ such that between any two vertices $u, v \in V(G)$ there exists a path where all the edges have different colors.

MCC-polynomial For every fixed $t \in \mathbb{N}$, $\chi_{mcc(t)}(G, k)$ is the number of vertex k -colorings $f : V(G) \rightarrow [k]$ for which every color induces a subgraph with a **connected component of maximal size t** .

Convex coloring polynomial $\chi_{convex}(G, k)$ is the number of **convex colorings**, i.e., vertex k -colorings $f : V(G) \rightarrow [k]$ such that every color induces a connected subgraph of G .

Makowsky and B. Zilber (2005) showed that $\chi_{rainbow}(G, k)$, $\chi_{mcc(t)}(G, k)$, and $\chi_{convex}(G, k)$ are graph polynomials with k as the variable.

Path-rainbow connected colorings were introduced by G. Chartrand et al. in 2008.

Their complexity was studied in S. Chakraborty et. al in 2008. $mcc(t)$ -colorings were first studied by N. Alon et al. in 2003.

Note $\chi_{mcc(1)}(G, k)$ is the chromatic polynomial.

Convex colorings were studied by S. Moran in 2007.

File:msol

Three graph polynomials, II

Proposition: The following connection matrices have infinite rank:

- (i) $M(\sqcup_1, \chi_{rainbow}(G, k));$
- (ii) $M(\sqcup_1, \chi_{convex}(G, k));$
- (iii) For every $t > 0$ the matrix $M(\bowtie, \chi_{mcc(t)}(G, k));$

Proof:

$\chi_{rainbow}(G, k)$: We use that the 1-sum of paths with one end labeled is again a path with $P_i \sqcup_1 P_j = P_{i+j-1}$ and that $\chi_{rainbow}(P_r, k) = 0$ iff $r > k + 3$.

$\chi_{convex}(G, k)$: We use edgeless graphs and disjoint union $E_i \sqcup E_j = E_{i+j}$ and that $\chi_{convex}(E_r, k) = 0$ iff $r > k$.

$\chi_{mcc(t)}(G, k)$: We use the join and cliques, $K_i \bowtie K_j = K_{i+j}$ and that $\chi_{mcc(t)}(K_r, k) = 0$ iff $r > kt$.

File:msol

Three graph polynomials, III

Corollary:

- (i) $\chi_{rainbow}(G, k)$ and $\chi_{convex}(G, k)$ are not CMSOL-definable in the language of graphs and hypergraphs.
- (ii) $\chi_{mcc(t)}(G, k)$ (for any fixed $t > 0$) is not CMSOL-definable in the language of graphs.
- (iii) In particular the chromatic polynomial is not CMSOL-definable in the language of graphs.

Note: It is however CMSOL-definable in the language of ordered hypergraphs.

Proof:

- (i) The 1-sum and the disjoint union are CMSOL-sum-like and CMSOL-smooth for hypergraphs.
- (ii) The join is only CMSOL-sum-like and CMSOL-smooth for graphs.

File:msol

Specific coefficients of graph polynomials

Let $p(G, \bar{X})$ be an *MSOL*-definable graph polynomial with values in $\mathbb{R}[\bar{X}]$ with m indeterminates X_1, \dots, X_m , and let

$$X_1^{\alpha_1} \cdot X_2^{\alpha_2} \cdot \dots \cdot X_m^{\alpha_m}$$

be a **specific monomial** of $p(G, \bar{X})$ with coefficient $c_\alpha(G)$, where $\alpha = (\alpha_1, \dots, \alpha_m)$.

Theorem:[GKM] Then there is an invariantly *MSOL*-definable graph polynomial $p_\alpha(G, \bar{X})$ such that $c_\alpha(G)$ is an evaluation of $p_\alpha(G, \bar{X})$.

Remark: The theorem remains valid for monomials of the form

$$X_1^{n_1(G)-\alpha_1} \cdot X_2^{n_2(G)-\alpha_2} \cdot \dots \cdot X_m^{n_m(G)-\alpha_m},$$

where $n_i(G) = |V(G)|$ or $n_i(G) = |E(G)|$.

This can be used to treat the coefficient of $X^{|V(G)|-3}$ of the characteristic polynomial.

Open problems

- (i) For what f is $r(f, k)$ always finite?
- (ii) For what f is $M(f, k)$ always positive semi-definite?
- (iii) What can we say in general about the various connection matrices of **additive** graph parameters?
In particular, are there **representation theorems** for additive graph parameters?
- (iv) What can we say in general about the various connection matrices of **maximizing (minimizing)** graph parameters?

Thank you for your attention!

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