# Interpretations – how to speak about sparsity in dense graphs

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November 30, 2018

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#### Interpretations



Interpretations:

- We start with a graph G and produce new graph H
- The new vertex set is determined by  $\nu(x)$
- The new edge set is determined by  $\psi(x, y)$

We will usually be in the situation when we want to a given graph H produce its 'pre-image' G. In this case we will often use colors.



## Research program

For any sparse graph class C:

- Characterize graph classes interpretable in C
- Find an algorithm to 'reverse' interpretations
- Find a model checking algorithm

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Done for bounded degree and partially for bounded expansion.

Today:

- Part I: Interpretations of graphs of bounded degree
- Part II: Shrub-depth interpretations of trees of bounded height
- ▶ Part III: Interpretations of bounded expansion classes

# Sparse graphs



Image by Felix Reidl

# Part I: Interpretations of graphs of bounded degree

## Interpretations of edgeless graphs with colors

Observation – no matter what the interpretation formula says, it will hold that:

- Each color will end up being a clique or independent set
- Between each two colors there will either be all edges or no edges



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Neighborhood diversity of a graph G is the number of equivalence classes of the twin relation.









Observe that equivalence class induces either a clique or an independent set.

## Interpretations and neighborhood diversity

#### Theorem

The following are equivalent for a class C of graphs:

Each graph in C has neighborhood diversity at most m

Each graph in C is interpretable in an edgeless graph with at most m colors



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- Each graph in C is interpretable in an edgeless graph with at most m colors

We care about this because graphs interpretable in graphs of bounded degree look approximately like graphs of small neighborhood diversity. Interpretation  $\psi(x, y)$  can be "decomposed" into two parts:

- ▶ global part: if two vertices u and v are far apart in G, then whether ψ(u, v) holds depends only on (local) types of u and v.
- ► local part: if two vertices u and v are close in G, then whether ψ(u, v) holds depends on how they interact.

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Example:  $\psi(x, y) \equiv x \neq y \land (x \text{ has degree 1 and } y \text{ has a neighbor of degree 2 or vice versa}) \lor (x \text{ and } y \text{ are at distance at most 2 and there is a vertex of degree exactly 4 on the path from x to y})$ 

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(x has degree 1 and y has a neighbor of degree 2 or vice versa) = one of them has degree 1 and the other has a neighbor of degree 2

Global part: there are four types of vertices:

- 1. Vertices having degree 1
- 2. Vertices having a neighbor of degree 2
- 3. Vertices having both properties
- 4. Vertices having neither property

# Analysing interpretations

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# Analysing interpretations

Typically there will be many more types of vertices, but always finitely many (the number is determined by  $\psi(x, y)$  and independent of G)

Consequence - the structure of a graph H interpreted in bounded degree graph G:

- We can partition V(H) into *m* parts and we will have:
- Global edges: between any two parts there will be basically all or no edges
- Local edges: every vertex can have some exceptions caused by the local part of the interpretations, but only a bounded number of them

# Structure of a graph intepreted in a graph of bounded degree

graph of small neighborhood diversity (global structure) small number of exceptions – from locality and small neighborhoods

#### Near-k-twin relation



#### Definition

Two vertices  $u, v \in V(G)$  are *near-k-twins* if  $|N(u)\Delta N(v)| \le k$ , i.e. their neighborhoods differ in at most k vertices.

Notation: 
$$u, v$$
 are near-k-twins  $- \{u, v\} \in \rho_k$ 

Example: complete bipartite graph minus a matching – vertices from the same parts are near-2-twins



Basic properties:

- $\rho_k$  is always reflexive and symmetric
- $\rho_k$  is **not** necessarily an equivalence
- $\rho_k$  equivalence does **not** imply  $\rho_{k+1}$  equivalence



Examples: graphs of degree at most d, complements of graphs of degree at most d, several subset complementations of graphs of degree at most d.



k=zd

## Near-k-twin equivalence with small number of classes



We want  $\rho_k$  on V(G) to be an equivalence with small number of classes.

This leads us to the following definition:

#### Definition

Graph class C is *near uniform* if there exists  $k_0$  and m such that for every for every  $G \in C$ :

- the relation  $\rho_k$  is an equivalence for at least one  $k \in \{1, \dots, k_0\}$
- For this k the equivalence has at most m classes

#### Theorem

Graph class  $\mathcal{D}$  is interpretable in class of graphs of degree at most d if and only if and only if  $\mathcal{D}$  is near-uniform.

We split the proof into two directions:

- Near uniformity implies interpretability in small degree
- Interpretability in small degree implies near uniformity

# Near uniformity implies interpretability

When  $\rho_k$  is an equivalence:

#### Lemma (Informally)

Informally: If  $\rho_k$  is an equivalence, then for every two large enough equivalence classes (in terms of k) there are almost all or almost no edges between these classes, and every vertex has bounded number (in terms of k) exceptions to this rule.

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# Near uniformity implies interpretability

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#### Corollary

Graph for which  $\rho_k$  is an equivalence consists of:

- Large and almost homogeneous groups of vertices
- Small groups of vertices connected arbitrarily to the rest of the graph

## $\rho_k$ an equivalence implies interpretability

Corollary

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- Large and almost homogeneous groups of vertices
- Small groups of vertices connected arbitrarily to the rest of the graph

This implies interpretability in a graph of small degree.



# Interpretability implies near uniformity

Formally, the "decomposition" of the interpretation formula into global and local types follows from from Gaifman's theorem.

The corollary we will use:

#### Lemma

Let  $\psi(x, y)$  be an interpretation formula and let u and v be two vertices of the same logical type. There exists  $r \in \mathbb{N}$  such that for every vertex w which has distance at least r from both u and v it holds that  $G \models \psi(u, w)$  if and only if  $G \models \psi(v, w)$ .



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#### Consequence:

Let  $H = I_{\psi}(G)$ . If u and v had the same type in G and if w was far away from both u and v in G, then w is adjacent to both u and v in H or none of them.

Interpretability implies near uniformity

Let G be of degree at most d and let  $H = I_{\psi}(G)$ . We know that: If u and v had the same type in G and if w was at distance more than r from both u and v in G, then w is adjacent to both u and v in H or none of them.

Crucial observation: Two vertices of H which were of the **same type in** G will have almost identical neighborhoods in H – they may disagree on at most constantly many (depending on d and r) vertices in H (these are the vertices which were close to them in G). This means that they will be **near-twins in** H.

Finishing the proof:

- Partition the vertices of G based on their type
- ► This partition corresponds to the near-k-twin equivalence

Algorithmic remark: near-k-twin relation can be computed quickly, an so to a given graph H we can compute its bounded degree pre-image efficiently.

Takeaway:

- Interpretations have a global and local part
- After identifying and eliminating the global part the resulting graph is (usually) going to be locally simple
- Complete characterization of graph classes interpretable in bounded degree graphs

# Part II: Interpretations of trees of small height = shrub-depth

Fix d (depth) and set C of colors of size m

Fix a relation  $R \subseteq C \times C \times \{2, 4, \dots, 2d\}$ 

Consider a tree T of depth d such that every leaf has one of m colors

Such a tree is called a *tree-model* and it defines graph *G* as follows:

- Vertices of G are leaves of T
- There is an edge between u and v if

 $(color(u), color(v), dist(u, v)) \in R$ 





Notice that every graph G has a tree model of depth 1 and at most |V(G)| colors

Consequence – it does not make sense to speak about depth of a single graph; depth has to be defined for classes of graphs

#### Definition

Shrub depth of a class C of graphs is the least d such that there exists m such that every graph in C has a tree model of depth d with at most m colors.

#### Theorem

Class C of graphs has bounded shrubdepth if and only if it is interpretable in the class of trees of bounded height

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- ⇒: simple, ψ(x, y) expresses the (finite) instructions encoded by relation R and ν(x) just says that x is a leaf
- $\blacktriangleright$   $\Leftarrow$ : technical, see next slides

#### Lemma (The hard direction of our theorem)

Every graph class interpretable in trees of bounded height has bounded shrub-depth

What we need to show:

Let C be a class of graphs interpretable in a class of trees of height h. There exist d and m such that for every  $G \in C$  there is a connection model T of height d and with m colors.



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Let C be a class of graphs interpretable in a class of trees of height h. There exist d and m such that for every  $G \in C$  there is a connection model T of height d and with m colors.

What we will use:

Let T be a tree of height h and let  $\psi(x, y)$  be an interpretation formula. Whether  $\psi(u, v)$  holds in T depends only on the types of u and v and on the types of vertices on the (short and unique) path between u and v.





# Wrapping it up

What you should know/remember:

- ▶ Bounded shrubdepth ⇒ bounded clique-width (shrubdepth is 'clique-depth')
- Class C of graphs has bounded shrubdepth if and only if it is interpretable in a class of colored trees.
- Bounded treedepth implies bounded shrubdepth.
- Class C of graphs of bounded shrubdepth has bounded treedepth if it does not contain arbitrary large complete bipartite graphs as subgraphs.
- Shrub-depth is closed under inderpretations.

Conjecture: Class C of graphs has bounded shrub depth if and only if it is not possible interpret arbitrary long induced paths in C.

Part III: Interpretations of bounded expansion graph classes

A class  $\mathcal{D}$  of graphs has *structurally bounded expansion* if there exists a class  $\mathcal{C}$  of graphs of bounded expansion and an interpretation I such that  $\mathcal{D} \subseteq I(\mathcal{C})$ 

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Our goal: find a structural/combinatorial characterization of graph classes with structurally bounded expansion

Class C of graphs has *low treedepth covers* if for every k there exist N and t such that for each  $G \in C$  we there is a system  $G_1, \ldots, G_N$  of induced subgraphs of G such that:

- Each  $G_i$  has treedepth at most t
- Each k-tuple of vertices is in at least one G<sub>i</sub>



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#### Lemma

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Dense counterpart of low treedepth covers:

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Dense counterpart of low treedepth covers:

#### Definition

Class C of graphs has *low shrubdepth covers* if for every k there exist N and class S of bounded shrubdepth such that for each  $G \in C$  we there is a system  $G_1, \ldots, G_N$  of induced subgraphs of G such that:

- Each  $G_i$  is from S
- Each k-tuple of vertices is in at least one G<sub>i</sub>

#### Theorem

Class C of graphs has structurally bounded expansion if and only if it has low shrubdepth covers.



We split the proof in two parts:

- 1. Structurally bounded expansion implies low shrubdepth covers
- 2. Low shrubdepth covers imply structurally bounded expansion

#### Structurally bounded expansion $\Rightarrow$ low shrubdepth covers

What we need to prove: If we start with a graph G from bounded expansion graph class and apply an interpretation then the resulting graph has a low shrubdepth cover.



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More precisely: For every bounded expansion graph class C and every interpretation I it holds: for every k there is N and class of bounded shrubdepth S such that every  $H \in I(C)$  can be k-covered by graphs  $H_1, \ldots, H_N$  from S.

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Outline:

- $\blacktriangleright$  Since  ${\mathcal C}$  has bounded expansion it has low treedepth covers
- ▶ For any *k* there exists *N* and class  $\mathcal{T}$  of bounded treedepth such that for each  $G \in \mathcal{D}$  is covered by graphs  $G_1, \ldots, G_N$  from  $\mathcal{T}$
- ► Idea apply *I* to each *G<sub>i</sub>* to obtain graphs *H<sub>i</sub>* of bounded shrubdepth (coming from *I*(*T*)) which cover *H* – does not quite work

Idea – apply I to each  $G_i \in \mathcal{T}$  to obtain graphs  $H_i$  of bounded shrubdepth (coming from  $I(\mathcal{T})$ ) which cover H – does not quite work

Let G be a graph, U subset of V(G) and I an interpretation. In general it does *not* hold that

$$I(G)[U] = I(G[U])$$

because the interpretation can use information outside G[U] to decide whether two vertices are adjacent. (Take  $U = V(G_i)$  to see the problem.)

Result of Dvořák, Král', Thomas (quantifier elimination): On a class of bounded expansion every formula  $\psi(x_1, \ldots, x_k)$  is equivalent to a quantifier-free formula  $\psi'(x_1, \ldots, x_k)$ 

Consequence: Whether  $\psi(u, v)$  is true in a graph depends only on a small number (fixed for  $\psi$ ) of vertices reachable from u and v by

function applications

Let  $S_v$  denote the set of vertices of G reachable by function applications from v. It holds that  $|S_v| \leq c$ , where c depends on  $\psi$ .

We want a p-shrubdepth cover of H:

- 1. Let G be such that  $H = I_{\psi(x,y)}(G)$ . We take a  $(p \cdot c)$ -treedepth cover  $G_1, \ldots, G_N$  of G.
- 2. In each  $G_i$  we consider set W of vertices v such that all c relevant vertices for v are also in  $G_i$ , i.e.  $S_v \subseteq W$ .
- 3. We consider  $I_{\psi}(G_i)$  and look at what happens with the set W– the graph induced by it has small shrubdepth (since  $I_{\psi}(G_i)$ has small shrubdepth) any two vertices in W have all the information necessary to determine whether  $\psi(x, y)$  holds, and so the adjacency in  $I_{\psi}(G_i)[W]$  is the same as in  $I_{\psi}(G_i)$

We need to show: If we can cover graph H by subgraphs of small shrubdepth then it is interpretable in a graph G from a class of graphs of bounded expansion.

Idea: Take a 2-shrubdepth cover of H consisting of graphs  $H_1, \ldots, H_N$ . These are inerpretable in trees  $T_1, \ldots, T_N$  of bounded height. Define *sparsify*(H) to be the union of these trees.

Surprisingly, this simple idea works (i.e. it produces a graph class of bounded expansion)

#### Low shrubdepth covers $\Rightarrow$ structurally bounded expansion

Let  $\ensuremath{\mathcal{D}}$  be a graph class with low shrubdepth covers. How do we show that the class

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Sparsify(\mathcal{D}) = \{Sparsify(H) \mid H \in \mathcal{D}\}
```

is of bounded expansion?

- 1. We show that if we start with a class with low shrub-depth covers and apply an interpretation, then the resulting graph class has low shrub-depth covers (quantifier elimination again)
- 2. We show that  $Sparsify(\mathcal{D})$  is actually an interpretation of  $\mathcal{D}$  and so by (1) it also has low shrub-depth covers
- 3. We observe that  $Sparsify(\mathcal{D})$  does not have large cliques or bi-cliques
- 4. Combining (2) and (3) implies that  $Sparsify(\mathcal{D})$  has low treedepth covers

### Transductions

Show that sparsification is a FO interpretation (crucial step, involves showing that one can define in G its decompositionl using FO logic)

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The issue: Tree-model has more vertices than the graph it defines. How do we interpret it in the graph?

We consider *transductions*. A transduction is a sequence of the following atomic operations:

- Creating new relations using formulas
- Removing relations
- Restricting the universe (deleting vertices)
- Adding arbitrary colors
- Copying
- Adding definable unary functions

Consequence of our result:

If we are given together with a graph H its 2-shrubdepth cover then we can perform FO model checking quickly on classes of graphs with structurally bounded expansion.

Main open questions:

- Computing low shrubdepth covers (it is sufficient to a compute 2-shrubdepth cover)
- Different characterizations of structurally bounded expansion
- Characterizing interpretations of nowhere dense graph classes