Algorithmic Meta-Theorems

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Minor Characterization

Minor-Free Graphs

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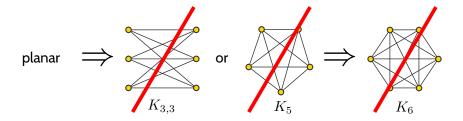
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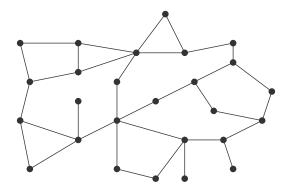
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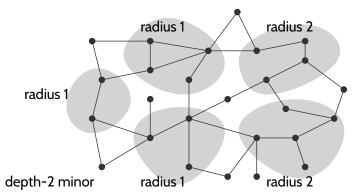
Every planar graph class and every class with bounded treewidth is minor-free. Proof for planar graphs:



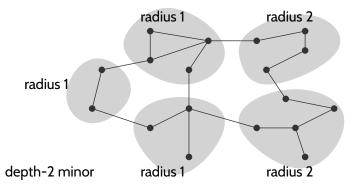


H is an *depth-r* minor of G ($H \preccurlyeq_r G$) if *H* can be built from *G* by

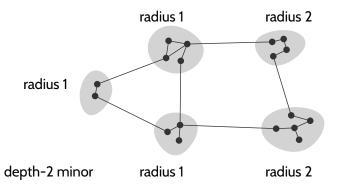
 $\, \odot \,$ picking some connected subgraphs with radius $\leq r.$



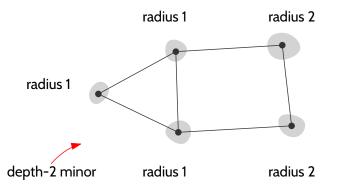
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- removing all vertices outide these subgraphs



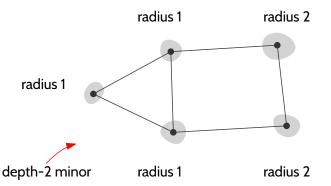
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Bounded Expansion

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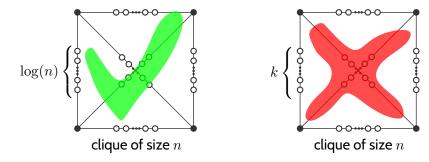
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Nowhere Dense

A graph class C is nowhere dense if there exists a function f(r) such that for all $r \in \mathbb{N}$ and all $G \in C$ we have $\omega_r(G) \leq f(r)$.



Many Sparse Graph Classes

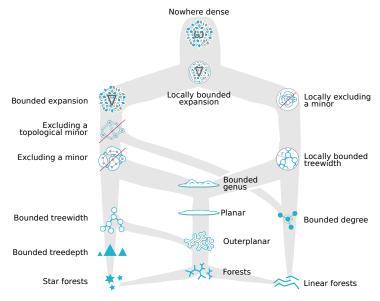


Figure by Felix Reidl

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Theorem (Grohe, Kreuzer, Siebertz 2017)

For graph class C that is closed under subgraphs holds C is nowhere dense iff the first-order model-checking problem on C is FPT (assuming FPT \neq AW[*]).

Main Results for Sparse Graphs

Theorem (Dvořák, Král, Thomas 2013)

Let C be a graph class with bounded expansion. There exists a function f such that for every FO formula φ and graph $G \in C$ one can decide whether $G \models \varphi$ in time $f(|\varphi|)n$.

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General rule: Things that work for bounded expansion also work for nowhere dense, but in an uglier way. This is why we focus on bounded expansion only in this course. We will first prove a weaker result that is a building block in many other algorithms.

Let C be a class with bounded expansion. There exists a function f such that for every *existential* FO formula φ and graph $G \in C$ one can decide whether $G \models \varphi$ in time $f(|\varphi|)n$. We will first prove a weaker result that is a building block in many other algorithms.

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This is (more or less) equivalent to deciding in time f(|H|)n whether a pattern graph H occurs as induced subgraph.

Existential Model-Checking

Proof of equivalence:

 \bigcirc Assume we want to know whether $G \models \varphi$ for some existential formula with q quantifiers. For example

 $\varphi = \exists x \exists y \exists z x {\sim} y \wedge y \not\sim z.$

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- $\bigcirc \text{ Now } G \models \varphi \text{ iff } G \text{ contains some graph from } \mathcal{H} \text{ as induced subgraph.}$
 - Assume $G \models \varphi$. Then the satisfying assignment describes induced subgraph H of G with $H \models \varphi$.
 - Assume $H \in \mathcal{H}$ is induced subgraph of G. Then $H \models \varphi$. This does not change while adding the remaining vertices of G.

How can we prove these results?

- Gaifman does not help much because neighborhoods can be the whole graph.
- So far, all we know that certain shallow minors are not present.
- If we have a better understanding of the structure of sparse graphs, this will help us.

There are many alternative definitions of bounded expansion and nowhere dense classes.

- shallow minors
- generalized coloring numbers
- low treedepth colorings
- transitive fraternal augmentations
- quasi-wideness
- connector-splitter games

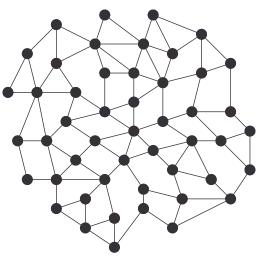
Which one is best depends on the task.

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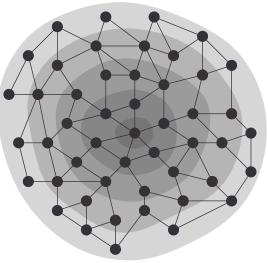
As a warmup, we solve the problem on planar graphs and then generalize the approach to bounded expansion.

On any planar graph you can do the following.

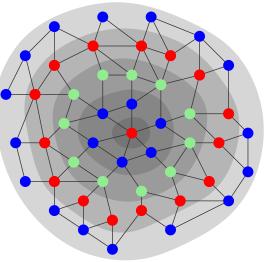


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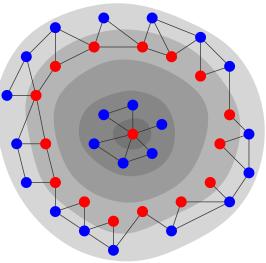
 \bigcirc do breadth-first search



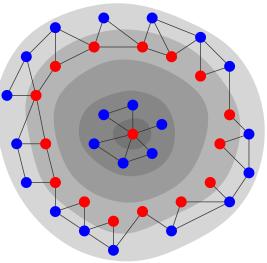
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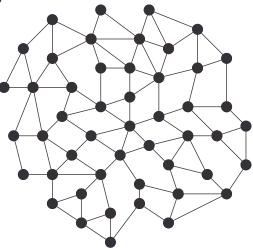


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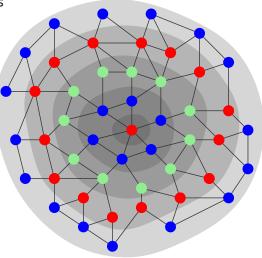
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- The resulting graph has treewidth at most 3p + 1.



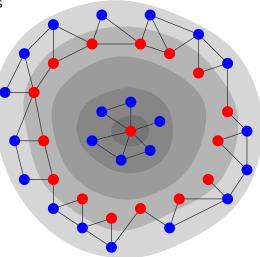


We want to know whether G has H as an induced subgraph.

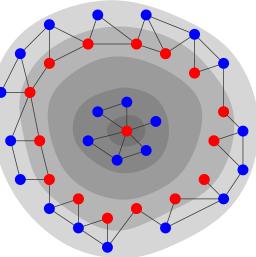
 \bigcirc color the graph as before with p = |H| + 1 colors.



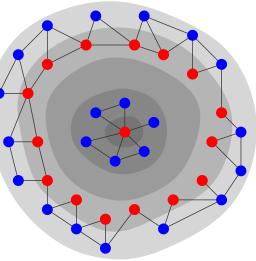
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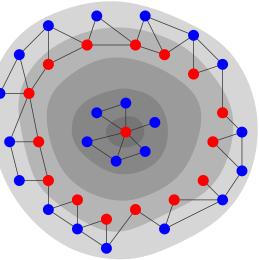


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Run time
$$\binom{p}{p-1} \cdot f(3p+1, |H|) \cdot n$$
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We used the following observation of planar graphs.

• For every p one can color the graph with p + 1 colors such that every set of p colors induces a graph with treewith at most 3p + 1. We used the following observation of planar graphs.

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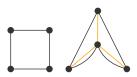
We can get something similar for bounded expansion.

 For every p one can color the graph with f(p) colors such that every set of p colors induces a graph with treedepth at most p.

Treedepth

Definition

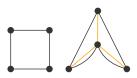
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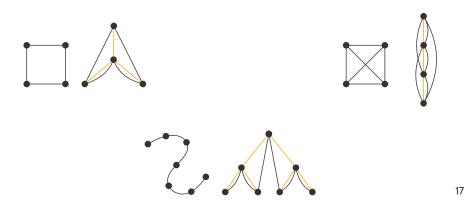




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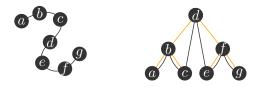
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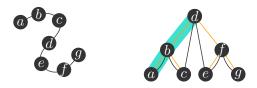


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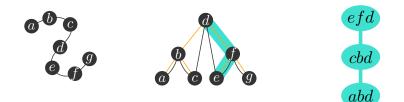




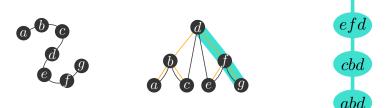
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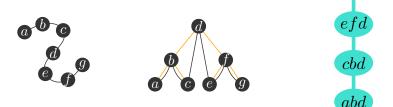
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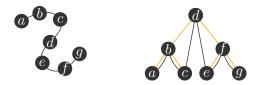
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A treedepth of a path with n vertices is exactly $\lceil \log(n+1) \rceil$.



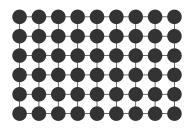
Nešetřil, Ossona de Mendez

A graph class C has bounded expansion iff there exists a function f such that for every $G \in C$ and $p \in \mathbb{N}$ one can color Gwith f(p) colors and every set of p colors induces a graph with treedepth $\leq p$.

Nešetřil, Ossona de Mendez

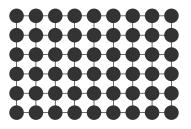
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What is f(2) for this graph?



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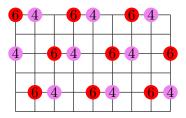


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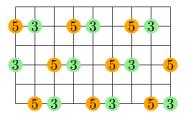
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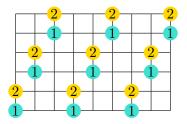
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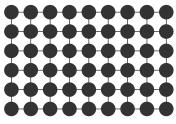
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Color it with p + 1 colors slicewise.

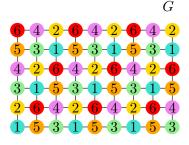
We can now use low-treedepth colorings to prove fpt existential model-checking.

Let C be a class with bounded expansion, having low treedepth colorings with function f(p). We want to know in time $h(|H|) \cdot n$ whether a graph $G \in C$ has H as induced subgraph.



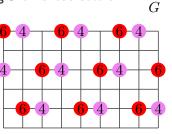
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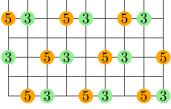
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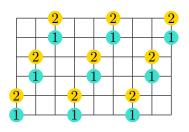
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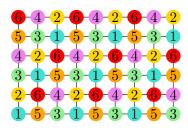
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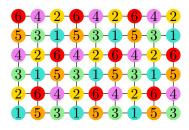
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- $\bigcirc \text{ We consider } {f(|H|) \choose |H|} \text{ color sets} \\ \text{ and for each we search for } H \\ \text{ in time } g(|H|) \cdot n \text{ using Courcelle.} \end{aligned}$



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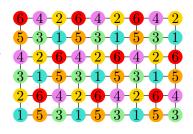
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- \bigcirc For p = |H| compute low treedepth coloring of G with f(p) colors.
- H occurs in G iff there exists a set of |H| colors such that H occurs in graph obtained by inducing G on these colors.
- $\bigcirc \text{ We consider } {f(|H|) \choose |H|} \text{ color sets} \\ \text{ and for each we search for } H \\ \text{ in time } g(|H|) \cdot n \text{ using Courcelle.} \end{cases}$
- \bigcirc Total run time $\binom{f(|H|)}{|H|}g(|H|) \cdot n$.
- Plus time needed to compute coloring!



G

After we previously proved the result for existential model-checking, we now prove the full version.

Theorem (Dvořák, Král, Thomas 2013)

Let C be a graph class with bounded expansion. There exists a function f such that for every FO formula φ and graph $G \in C$ one can decide whether $G \models \varphi$ in time $f(|\varphi|)n$.

This is the most involved proof presented in this course. We will again use low-treedepth colorings.

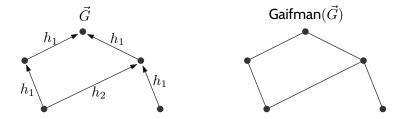
A functional graph \vec{G} is a structure with signature $\tau = \{h_1, h_2, \dots, R_1, R_2, \dots, Q_1, Q_2, \dots\}$ where $h_1(d) = b$ $h_2(d) = c$ $h_1: V \to V$ are unary functions $R_i \subseteq V$ are unary relations $Q_i \in \{0, 1\}$ are nullary relations

You can think of it as follows

- $\bigcirc h_i(u) = v$ equals directed edge from u to v of the ith type,
- \bigcirc $R_i(u)$ equals labeling u with ith label.
- $\bigcirc Q_i$ equals a globally acessible truth value.

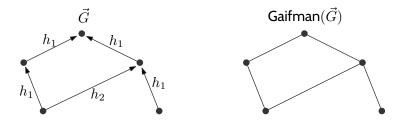
Classes

For a functional graph \vec{G} , the graph Gaifman (\vec{G}) has the same vertex set and edges uv iff $h_i(u) = v$ or $h_i(v) = u$ for some i.



Classes

For a functional graph \vec{G} , the graph Gaifman (\vec{G}) has the same vertex set and edges uv iff $h_i(u) = v$ or $h_i(v) = u$ for some i.



We say a class of functional graphs has *bounded expansion* if the class of their Gaifman graphs has.

Reduction

If we can solve the model-checking problem in time $f(|\varphi|)n$ on functional graph classes with bounded expansion then we can also do it in time $f(|\varphi|)n$ on normal graph classes with bounded expansion.

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Proof: Let C be a normal class with bounded expansion. Then C has bounded degeneracy d.



Reduction

If we can solve the model-checking problem in time $f(|\varphi|)n$ on functional graph classes with bounded expansion then we can also do it in time $f(|\varphi|)n$ on normal graph classes with bounded expansion.

Proof: Let C be a normal class with bounded expansion. Then C has bounded degeneracy d.



Compute degeneracy ordering. Let $h_i(v)$ point to $i{\rm th}$ left neighbor of v. Replace in φ every occurence of $x{\sim}y$ with

$$\bigwedge_{i=1}^{d} h_i(x) = y \lor h_i(y) = x.$$

We therefore want to prove the following.

Theorem (Dvořák, Král, Thomas 2013)

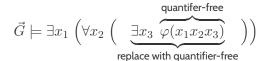
Let \vec{C} be a functional graph class with bounded expansion. For every graph $\vec{G} \in \vec{C}$ and FO formula φ one can decide whether $\vec{G} \models \varphi$ in time $f(|\varphi|)n$.

 $\vec{G} \models \exists x_1 ($

$$\vec{G} \models \exists x_1 \left(\forall x_2 \right)$$

$$\vec{G} \models \exists x_1 \left(\forall x_2 \left(\exists x_3 \right) \right)$$

$$\vec{G} \models \exists x_1 \left(\forall x_2 \left(\exists x_3 \ \overbrace{\varphi(x_1 x_2 x_3)}^{\text{quantifer-free}} \right) \right)$$



quantifier-free $\vec{G}' \models \exists x_1 \left(\forall x_2 \quad \overbrace{\varphi'(x_1 x_2)}^{\prime} \right)$

quantifier-free $\vec{G}' \models \exists x_1 \left(\forall x_2 \quad \widetilde{\varphi'(x_1 x_2)} \right)$

replace with quantifier-free

quantifier-free $\vec{G}'' \models \exists x_1 \quad \widetilde{\varphi''(x_1)}$

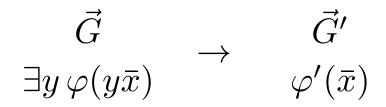
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quantifier-free $\vec{G}''' \models \qquad \widehat{\varphi'''}$

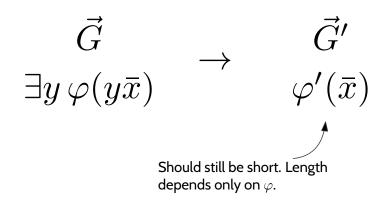


We shift complexity from the formula to the graph. G', G'', G''' have same vertices and edges but additional unary and nullary relations.

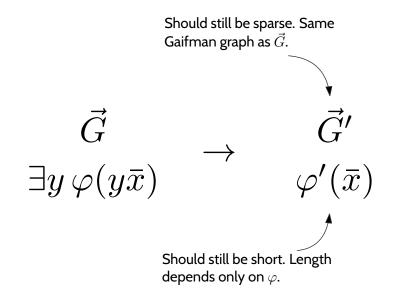
Quantifier Elimination



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For every $\vec{G} \in \vec{C}$ one can compute in time $O(|\vec{G}|)$ a functional graph \vec{G}' with the same Gaifman graph as \vec{G} and

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For every $\vec{G} \in \vec{C}$ one can compute in time $O(|\vec{G}|)$ a functional graph \vec{G}' with the same Gaifman graph as \vec{G} and

$$\vec{G} \models \exists y \, \varphi(y \bar{v}) \quad \text{iff} \quad \vec{G}' \models \varphi'(\bar{v}) \qquad \text{for all } \bar{v} \in V(\vec{G})^{|\bar{x}|}.$$

$$\vec{G} \models \exists x_1 \ \Bigl($$

$$\vec{G} \models \exists x_1 \left(\forall x_2 \left(\begin{array}{c} \\ \end{array} \right) \right)$$

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replace with quantifier-free

If there is a quantifier elimination procedure for classes with bounded expansion, this proves our main result. We use De Morgan to get rid of universal quantifiers.

$$\vec{G'} \models \exists x_1 \left(\forall x_2 \quad \overbrace{\varphi'(x_1 x_2)}^{\text{quantifier-free}} \right)$$

If there is a quantifier elimination procedure for classes with bounded expansion, this proves our main result. We use De Morgan to get rid of universal quantifiers.

$$\vec{G'} \models \exists x_1 \neg \left(\exists x_2 \quad \overbrace{\neg \varphi'(x_1 x_2)}^{\text{quantifier-free}} \right)$$

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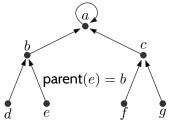
quantifier-free $\widehat{\mathbf{G}'''}$ $\vec{G}^{\prime\prime\prime}\models$

Roadmap: Construct quantifier elimination for graph classes of increasing complexity.

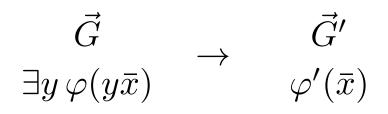
- forests of bounded depth
- bounded treedepth
- bounded expansion

The simplest functional structures we work with are *functional forests*.

There are unary relations (labels) and exactly one unary function "parent" describing the parent relation of a rooted forest (roots point to themselves).



Let ${\cal C}$ be a class of functional forests with bounded depth. Then ${\cal C}$ has a quantifier elimination procedure.



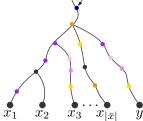
Since $\varphi(y\bar{x})$ is quantifier free, it is a boolean combination of atoms of the form

- \bigcirc **R** for some nullary relation R
- $\bigcirc R(\mathsf{parent}^i(s))$ for unary R, $i \leq d$ and variable $s \in yar{x}$
- \bigcirc parentⁱ(s) = parent^j(t) for $i, j \leq d$ and variables $s, t \in y\bar{x}$

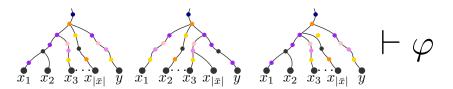
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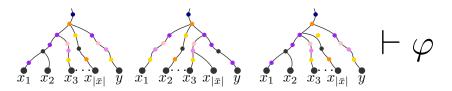
 $\varphi(y\bar{x})$ can only talk about the connections between and labelings of ancestors of $y\bar{x}$.



Let \mathbb{T} be the set of all such trees that imply φ .



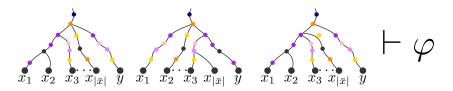
Let \mathbb{T} be the set of all such trees that imply φ .



We see every $T \in \mathbb{T}$ as a formula $T(y\bar{x})$ checking if ancestor tree of $y\bar{x}$ equals T. Then

$$\exists y \, \varphi(y\bar{x}) = \exists y \, \bigvee_{T \in \mathbb{T}} T(y\bar{x})$$

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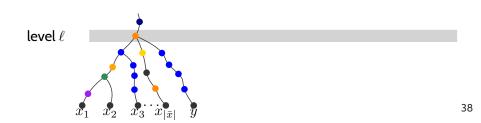


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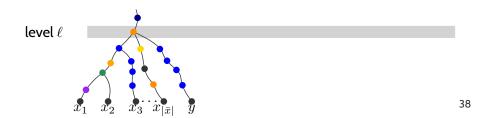
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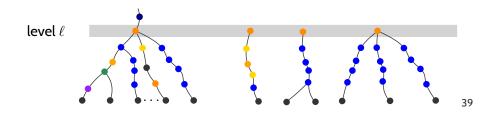


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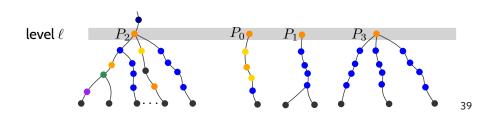
It enforces that the ancestors of \bar{x} induce a certain tree and that there exists y that hits this tree via a "special path" with certain labels at a certain ancestor at height l.



We now augment the graph.

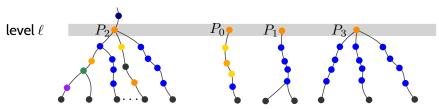


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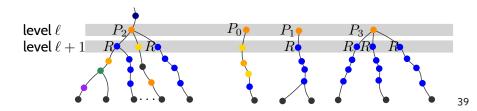
 \bigcirc round all numbers larger than $|\bar{x}|$ up to ∞ .



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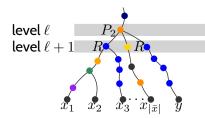
For all w at level l + 1 add label R(w) if w lies on a special path.



We construct a quantifier-free formula $T'(\bar{x})$ equivalent to $\exists y T(y\bar{x})$. This formula can only check the ancestor tree of \bar{x} .

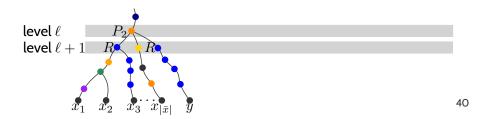


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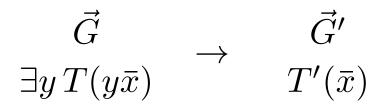


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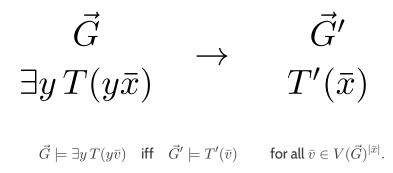
If we want to know if there is y reaching an ancestor s of \bar{x} , we can check whether s has more ancestors than are in the tree of \bar{x} .



For every ancestor tree $T \in \mathbb{T}$ we can perform quantifier elimination.



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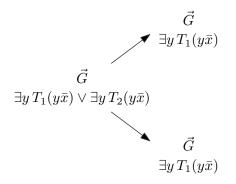


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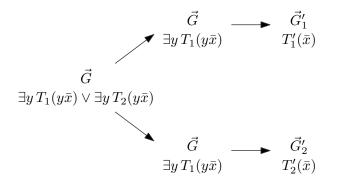
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$$\vec{G} \\ \exists y \, T_1(y\bar{x}) \lor \exists y \, T_2(y\bar{x})$$

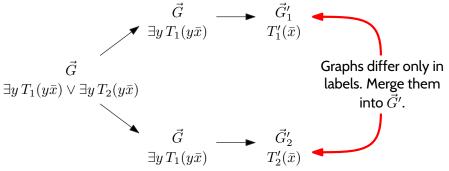
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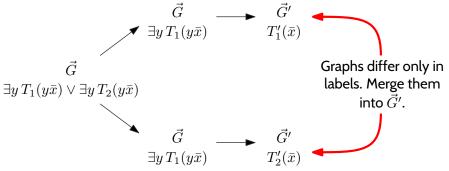
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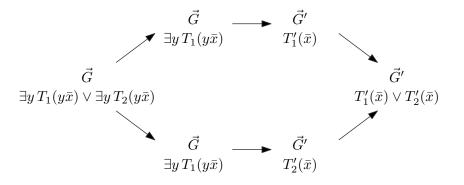
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Next, we consider functional graph classes whose Gaifman graphs have *bounded treedepth*.



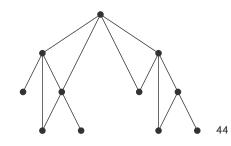
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Let C be a class whose Gaifman graphs have bounded treedepth. Then C has a quantifier elimination procedure.

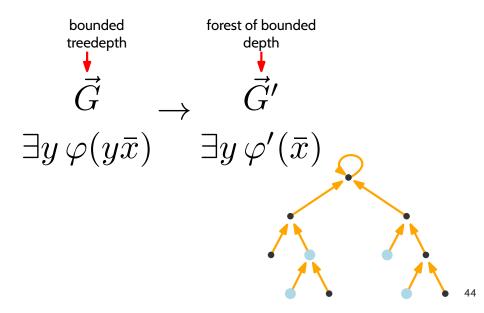


Bounded Treedepth

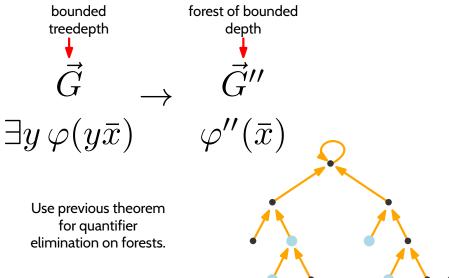
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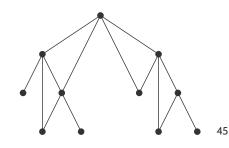
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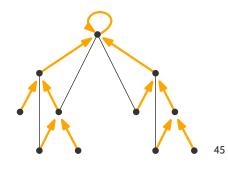
Bounded Treedepth



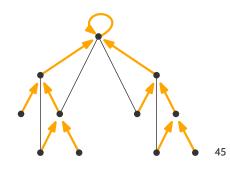
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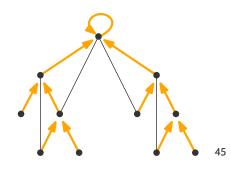
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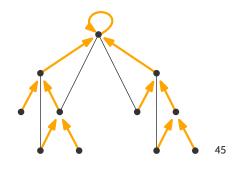
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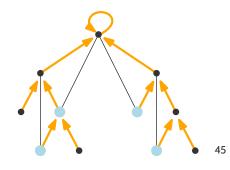
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- Consider Gaifman graph of *G*. Build depth-first search tree and make it functional. Graphs with treedepth *d* contain no paths longer than 2^d. We have a functional forest of depth at most 2^d.
- All edges go between ancestors in the tree.

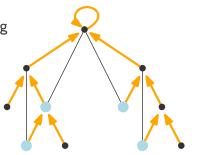


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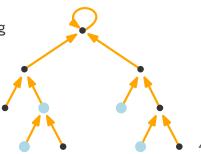
 $P_{i,j,\uparrow}(v)$: "There is edge from vto parentⁱ(v) labeled with j going upwards/downwards".



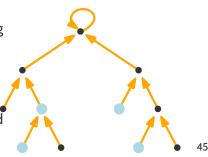
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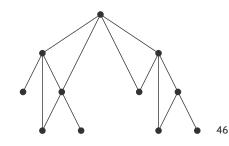
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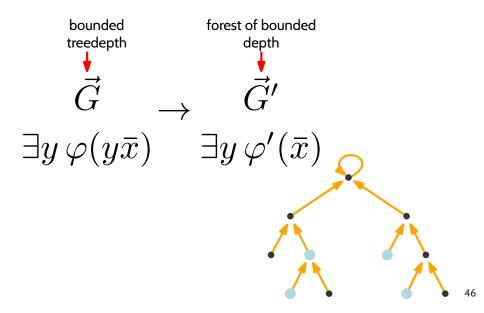


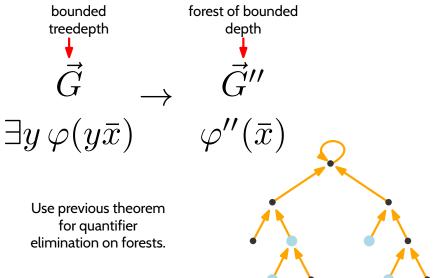
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 - $P_{i,j,\uparrow}(v)$: "There is edge from vto parentⁱ(v) labeled with j going upwards/downwards".
- \bigcirc This tree fully encodes \vec{G} .
- Replace atoms f_j(x) = y by guessing tree-relationship and checking the new predicates.



bounded treedepth \vec{G} $\exists y \, \varphi(y\bar{x})$







The last step.

Let $\mathcal C$ be a class with bounded expansion. Then $\mathcal C$ has a quantifier elimination procedure.

We are given a formula $\exists y \varphi(\bar{x})$ where φ is quantifier-free.

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Replace all function applications such as $p(g(x_i)) = x_j$ with directed labeled edges such as $\exists y \, x_i \, \overset{}{\mathcal{Y}} \, y \wedge y \, \overset{}{\mathcal{Y}} \, x_j$.

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The result is a formula $\exists \bar{y} \psi(\bar{y}\bar{x})$ on a normal (non-functional) directed edge-labeled graph G.

For every $\bar{v} \in V(G)^{|\bar{x}|}$

 $G \models \exists \bar{y} \, \psi(\bar{y} \bar{v}) \quad \text{iff} \quad$

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Let Λ be the colors of a low-treedepth coloring of G where every subgraph on $|\bar{y}\bar{x}|$ colors has treedepth $\leq g(|\bar{y}\bar{x}|)$.

For every $\bar{v} \in V(G)^{|\bar{x}|}$

$$G \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$

$$\bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \land$$

Let Λ be the colors of a low-treedepth coloring of G where every subgraph on $|\bar{y}\bar{x}|$ colors has treedepth $\leq g(|\bar{y}\bar{x}|)$.

For every $\bar{v} \in V(G)^{|\bar{x}|}$

$$G \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$

$$\bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \wedge G[S] \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$

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For all graphs G[S] (of bounded treedepth) we perform quantifier elimination.

For every $\bar{v} \in V(G)^{|\bar{x}|}$

$$G \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$

$$\bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \wedge G[S] \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$
$$\bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \wedge \vec{G}'_S \models \psi_S(\bar{v}) \quad \text{iff}$$

For all graphs G[S] (of bounded treedepth) we perform quantifier elimination.

For every $\bar{v} \in V(G)^{|\bar{x}|}$

 $|S| = |\bar{y}\bar{x}|$

$$G \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$

$$\bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \land G[S] \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$
$$\bigvee_{S \subseteq \Lambda} \quad \operatorname{colors}(\bar{v}) \subseteq S \land \vec{G}' \models \psi_S(\bar{v}) \quad \text{iff}$$

For all graphs G[S] (of bounded treedepth) we perform quantifier elimination. And stack the graphs on top of each other.

For every $\bar{v} \in V(G)^{|\bar{x}|}$

$$G \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$

$$\bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \wedge G[S] \models \exists \bar{y} \, \psi(\bar{y}\bar{v}) \quad \text{iff}$$
$$\bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \wedge \vec{G}' \models \psi_S(\bar{v}) \quad \text{iff}$$
$$\vec{G}' \models \bigvee_{\substack{S \subseteq \Lambda \\ |S| = |\bar{y}\bar{x}|}} \operatorname{colors}(\bar{v}) \subseteq S \wedge \psi_S(\bar{v}).$$

Finally, pull out the graph.

This completes the proof. We have solved the model-checking problem on bounded expansion by performing quantifier elimination on trees and lifting it up using low treedepth colorings.