

# Algorithmic Meta-Theorems for Restrictions of Treewidth

Michael Lampis

Computer Science Dept.

Graduate Center, City University of New York

# Algorithmic Meta-Theorems

## Algorithmic Theorems

- Vertex Cover, Dominating Set, 3-Coloring are solvable in linear time on graphs of constant treewidth.
- Vertex Cover, Feedback Vertex Set can be solved in sub-exponential time on planar graphs

# Algorithmic Meta-Theorems

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  - All **MSO-expressible** problems are solvable in linear time on graphs of constant treewidth.
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- Main uses: quick complexity classification tools, mapping the limits of applicability for specific techniques.
- This talk: Algorithmic Meta-Theorems where the class of problems is defined using logic.

# First Order Logic on graphs

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Example:



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Example: Dominating Set of size 2

$$\exists x_1 \exists x_2 \forall y E(x_1, y) \vee E(x_2, y) \vee x_1 = y \vee x_2 = y$$

# (Monadic) Second Order Logic

- MSO logic: we add set variables  $S_1, S_2, \dots$  and a  $\in$  predicate. We are now allowed to quantify over sets.
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Example: 2-coloring

$$\exists V_1 \exists V_2 \forall x \forall y E(x, y) \rightarrow (x \in V_1 \leftrightarrow y \in V_2)$$

# The model checking problem

Problem: **p-Model Checking**

Input: Graph  $G$  and formula  $\phi$

Parameter:  $|\phi|$

Question:  $G \models \phi?$

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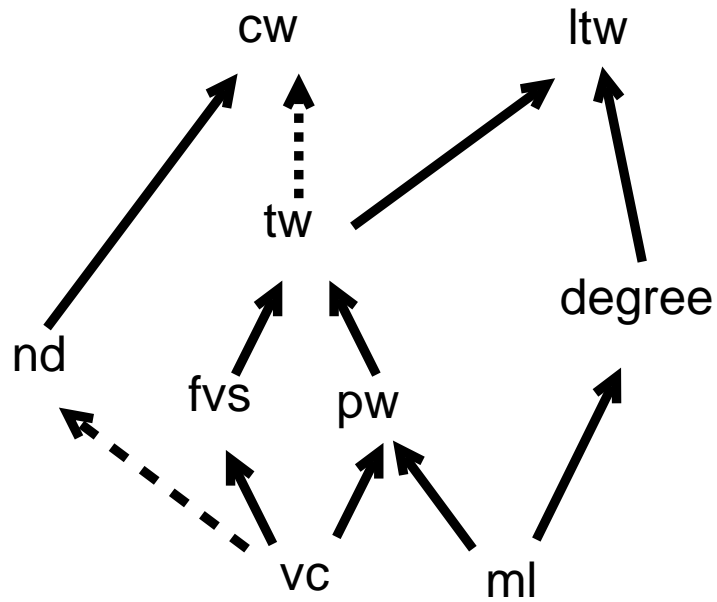
- For general graphs, this problem is W-hard even for FO logic
- We are interested in finding tractable, i.e. FPT, cases for more restricted classes of graphs.
- The most famous such result is Courcelle's theorem which states that p-Model Checking for  $\text{MSO}_2$  logic is FPT when also parameterized by the graph's treewidth.

# Lower Bounds

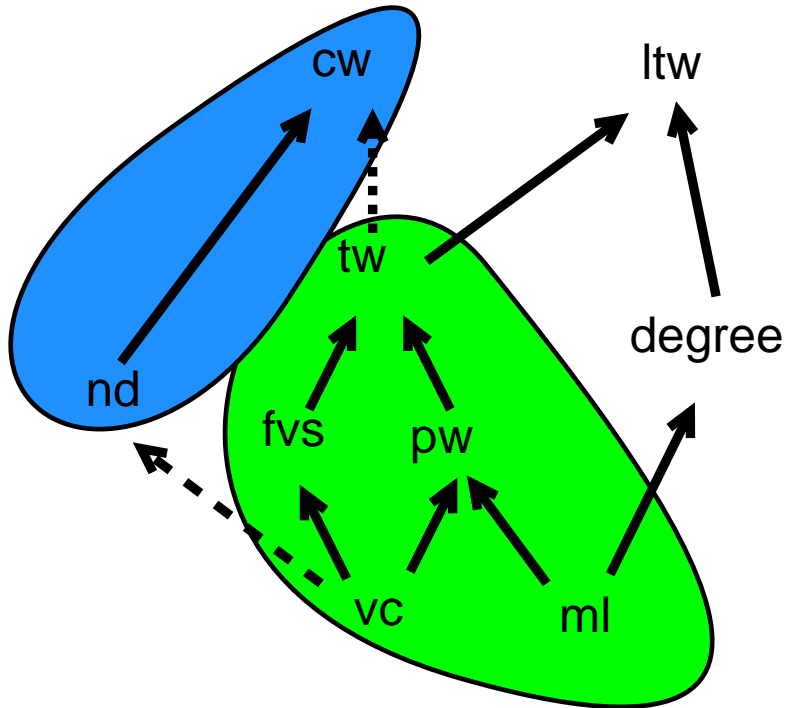
- Courcelle's theorem states that deciding if  $G \models \phi$  can be done in time  $f(tw(G), \phi) \cdot |G|$ , for some function  $f$ .
- Unfortunately, in the worst case this function is horrible!
  - [Frick and Grohe 2004]: There is no algorithm which solves p-Model Checking on trees in time  $O(f(\phi) \cdot n)$  for any elementary function  $f$  unless  $P=NP$ .
  - The lower bound applies also to FO logic, under the stronger assumption  $FPT \neq AW[*]$
- Motivation: see if things improve when one looks at more restricted classes of graphs.

# Graph classes

Some popular graph classes



# Graph classes

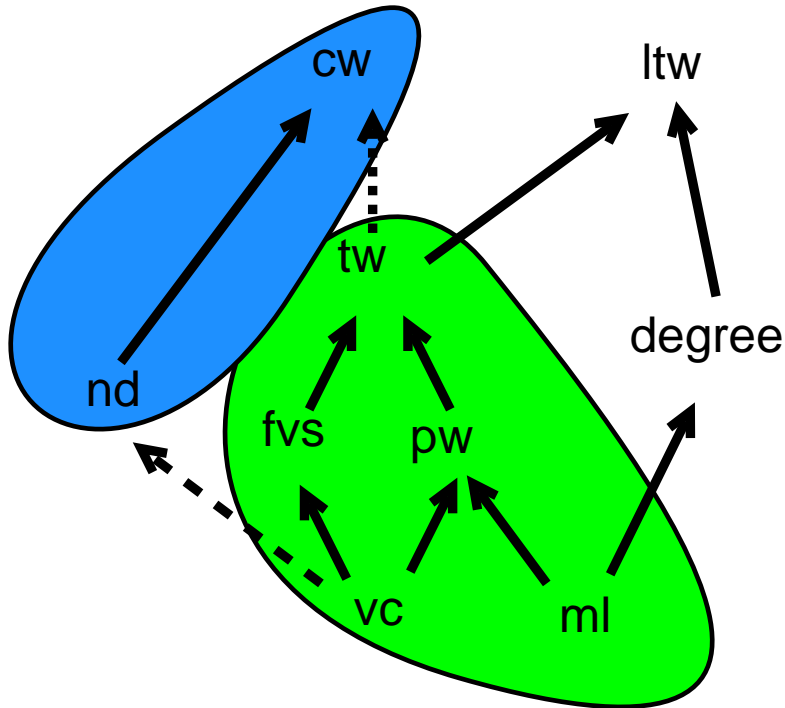


## Some popular graph classes

- FO logic is FPT for all,  $\text{MSO}_1$  for the blue area,  $\text{MSO}_2$  for the green area.
- Lower bounds:
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Our focus is on improving on the bottom.

# Summary of results

- FO logic for graphs of bounded vertex cover is singly exponential
- FO logic for graphs of bounded max-leaf number is singly exponential
- MSO logic for graphs of bounded vertex cover is doubly exponential
- Tight lower bounds (under the ETH) for vertex cover
- Generalize FO and  $\text{MSO}_1$  results to neighborhood diversity

# Graphs with small Vertex Cover

- A vertex cover is a set of vertices whose removal makes the graph an independent set.
- Usually viewed as just an optimization problem, but the existence of a small vertex cover gives a graph a very special form.
- Small vertex cover trivially implies small treewidth.
- It makes sense to study problems hard for treewidth parameterized by vertex cover
  - Good example: Bandwidth

# Vertex cover - A warm-up

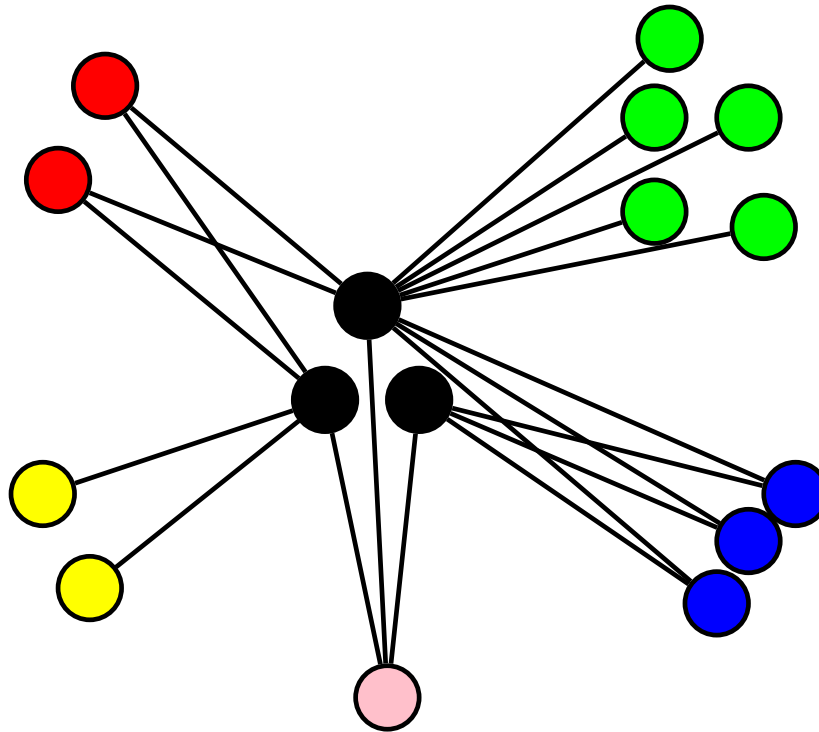
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# Vertex cover - A warm-up

- Model checking FO logic on graphs of bounded vertex cover is singly exponential.
- Intuition:
  - Model checking FO logic on general graphs is in XP: each time we see a quantifier, we try all possible vertices.
  - The existence of a vertex cover of size  $k$  partitions the remainder of the graph into at most  $2^k$  sets of vertices, depending on their neighbors in the vertex cover.
  - Crucial point: Trying all possible vertices in a set is wasteful. One representative suffices.

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# Vertex cover - A warm-up

- Model checking FO logic on graphs of bounded vertex cover is singly exponential.
- Algorithm: For each of the  $q$  quantified vertex variables in the formula try the following
  - Each of the vertices of the vertex cover ( $k$  choices)
  - Each of the previously selected vertices ( $q$  choices)
  - An arbitrary representative from each type ( $2^k$  choices)
- Total time:  $O^*(k + q + 2^k)^q = O^*(2^{kq+q \log q})$

# Max-Leaf Number

- The max-leaf number of graph  $ml(G)$  is the maximum number of leaves of any sub-tree of  $G$ .
- Again, small max-leaf number implies a special structure
  - Trivially, small degree and small treewidth
  - [Kleitman and West] A graph of max-leaf number  $k$  is a sub-division of a graph of at most  $O(k)$  vertices.
- Again, it makes sense to study problems hard for treewidth parameterized by max-leaf number
  - Good example: Bandwidth



# FO logic on paths

- Let us first try to solve this basic problem: Given a path on  $n$  vertices and a FO sentence  $\phi$ , decide if  $\phi$  holds on that path.
- This is an important special case of max-leaf number graphs. We cannot use the previous technique since the vertex cover is high.

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- Key intuition: if the path is very long, its precise length does not matter.

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- By applying the lemma, any path can be shortened to size  $2^q$ . Applying the trivial algorithm for FO logic gives a time bound of  $O^*(2^{q^2})$
- This is a classic idea related to Ehrenfaucht-Fraisse games in logic.

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- Lemma: If a topo-edge has length at least  $2^q$  it can be shortened without affecting the truth value of any FO sentence with at most  $q$  quantifiers.
- The graph can be reduced to size  $O(k^2 2^q)$  so the trivial FO algorithm runs in  $2^{O(q^2 + q \log k)}$



# MSO logic for vertex cover (sketch)

- Trivial algorithm: for each set variable, try all  $2^n$  subsets.
- Use types: complexity comes down to  $n^{f(k,q)}$ , not good enough!
  - Intuition: when selecting a set only the number of vertices of each type matters.
- Basic idea: prove that a lot of sets are equivalent for MSO sentences with at most  $q$  quantifiers.
  - Intuition: the exact number of vertices from each type matters only if it's  $< 2^q$  (or the complement has size  $< 2^q$ ).
- End result:  $2^{2^{O(k+q)}}$  (doubly exponential) algorithm.

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- Our results will rely on the ETH
- ETH: There is no  $2^{o(n)}$  algorithm for 3SAT.

# Reduction (sketch)

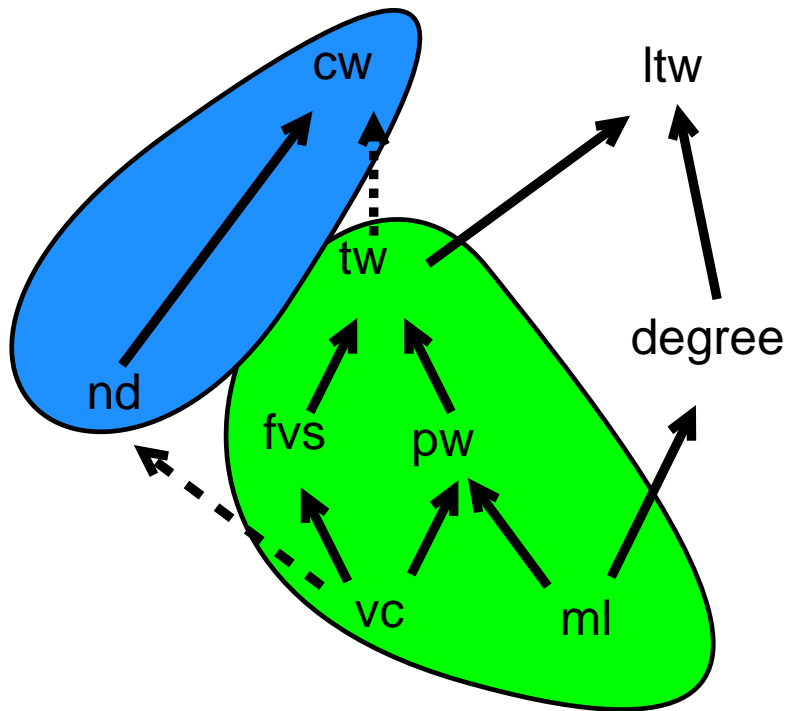
- Reduction from 3-SAT to model checking.
- Create a graph  $G$  to encode a propositional formula with  $n$  variables.
- $G$  will have vertex cover  $O(\log n)$ . The MSO formula will have constant size.
  - Each vertex of the vertex cover encodes one of the bits in the index of the propositional variables.
- A  $2^{2^{o(k+q)}}$  algorithm would then give  $2^{2^{o(\log n)}} = 2^{o(n)}$  algorithm for 3SAT.
- Same reduction works for FO logic, starting from weighted 3-SAT.

# Neighborhood diversity

- We have seen that we can prove stronger meta-theorems for bounded vertex cover than we can for bounded treewidth.
- However, we are essentially only using one property of bounded vertex cover graphs: the fact that vertices can be partitioned into a small number of types.
- This motivates the following definition:
  - The neighborhood diversity of a graph is the minimum number  $nd(G)$  s.t. the vertices of  $G$  can be partitioned in  $nd(G)$  sets with all vertices in each set having the same type.
- Observe that this is a strict superset! Example: complete bipartite graphs.



# Graph classes



- Neighborhood diversity is a special case of clique-width but incomparable to treewidth.
- Our results for FO logic and  $\text{MSO}_1$  logic can trivially be extended to nd.
- $\text{MSO}_2$  is FPT for vertex cover (Courcelle) but W-hard for clique-width. What about nd?

# Conclusions - Open problems

- Stronger meta-theorems (and some lower bounds) for restrictions of treewidth.
  - MSO is doubly exponential for  $vc$  (upper and lower bound).
  - FO is singly exponential for  $vc$  (upper and lower bound) and for  $ml$ .
- Interesting to continue this line of work for other such graph classes or for other logics.
- More concrete open problems:
  - $MSO_2$  for  $nd$
  - Lower bound for FO on max-leaf
  - MSO for max-leaf

Thank you!