# Solving a Family of <br> Multivariate Optimization and Decision Problems on Classes of Bounded Expansion 

Daniel Mock
Joint work with Peter Rossmanith
AlgoOpt 2023, November 14, Aachen


Theoretical Computer Science

## Algorithms For...

## Max Partial Vertex Cover

Problem: How many edges can be covered by set of $k$ vertices?

## Red Blue Partial Dominating Set

Problem: Are there $k$ vertices dominating $\geq t_{\text {red }}$
red and $\geq t_{\text {blue }}$ blue vertices?

## Fair Dominating Matching

Problem: Is there a matching of size $k$ that dominates twice as many red as blue vertices?

## Half Triangle Deletion

Problem: Can we destroy half of the triangles and squares by deleting $k$ vertices?

## Algorithms For...

## Max Partial Vertex Cover

Problem: How many edges can be covered by set of $k$ vertices?

## Red Blue Partial Dominating Set

## Problem: Are there $k$ vertices dominating $\geq t_{\text {red }}$

 red and $\geq t_{\text {blue }}$ blue vertices?
## Fair Dominating Matching

Problem: Is there a matching of size $k$ that dominates twice as many red as blue vertices?

## Half Triangle Deletion

Problem: Can we destroy half of the triangles and squares by deleting $k$ vertices?

On graph classes

- Of bounded treewidth
- Of bounded degree
- Planar Graphs

We give one algorithm for that!

We give one meta-algorithm for that!

## Algorithmic Meta-Theorems

## "Every problem expressible in logic L can be solved efficiently on graph class $\mathcal{C}$."

## Algorithmic Meta-Theorems

"Every problem expressible in logic $L$ can be solved efficiently on graph class $\mathcal{C}$."


## Model-Checking

```
MC(L,C)
    Input: A graph }G\in\mathcal{C}\mathrm{ and a sentence }\varphi\in
    Problem: Is }\varphi\mathrm{ true in G? (G}\models\varphi\mathrm{ ?)
    Parameter: | }
```

$M C(F O, \mathcal{G})$ is hard (PSPACE-hard and AW[*]-hard)

Goal: Find classes $\mathcal{C}$ and logic $L$ where $M C(L, \mathcal{C})$ is FPT (time complexity of $\left.f_{\mathcal{C}}(|\varphi|) n^{d}\right)$

## Model-Checking

## $M C(L, \mathcal{C})$

Input: $\quad$ A graph $G \in \mathcal{C}$ and a sentence $\varphi \in L$
Problem: Is $\varphi$ true in $G$ ? $(G \models \varphi$ ?)
Parameter: $|\varphi|$
$M C(F O, \mathcal{G})$ is hard (PSPACE-hard and AW[*]-hard)
Goal: Find classes $\mathcal{C}$ and logic $L$ where $M C(L, \mathcal{C})$ is FPT (time complexity of $\left.f_{\mathcal{C}}(|\varphi|) n^{d}\right)$


## Sparse Graph Classes



## Bounded Expansion

Class has bounded expansion if: there is a function $f$ s.t.

$$
\begin{aligned}
& \frac{|E|}{|V|} \leq f(r) \\
& \text { for every } r \text {-shallow minor } \\
& \text { of every graph in } \mathcal{C}
\end{aligned}
$$

## Bounded Expansion



Class has bounded expansion if: there is a function $f$ s.t.
$|E|$
$\frac{\mid \overline{|V|}}{\mid v f(r)}$
for every $r$-shallow minor of every graph in $\mathcal{C}$

Many other characterizations: copwidth game, weak coloring numbers, neighborhood complexity, treedepth colorings, neighborhood covers, ...

## First-Order with Some Counting: $\operatorname{FO}(\{>0\})$

## Definition of FO $(\{>0\})$ (Dreier, Rossmanith, '21)

Built recursively using

- the rules of FO
- $\# y \varphi\left(y, x_{1}, \ldots, x_{k}\right) \geq m \quad$ for every $m \in \mathbb{N}$ and $\operatorname{FO}(\{>0\})$ formula $\varphi$

Fragment of $\mathrm{FO}(\mathbb{P})$ and $\operatorname{FOC}(\mathbb{P})$ (Kuske, Schweikardt '17)

## First-Order with Some Counting: $\operatorname{FO}(\{>0\})$

## Definition of FO $(\{>0\})$ (Dreier, Rossmanith, '21)

Built recursively using

- the rules of FO
- $\# y \varphi\left(y, x_{1}, \ldots, x_{k}\right) \geq m \quad$ for every $m \in \mathbb{N}$ and $\mathrm{FO}(\{>0\})$ formula $\varphi$

Fragment of $\mathrm{FO}(\mathbb{P})$ and $\mathrm{FOC}(\mathbb{P})$ (Kuske, Schweikardt '17)

PartDomSet:

$$
\exists x_{1} \ldots \exists x_{k} \# y\left(\bigvee_{1 \leq i \leq k} E\left(y, x_{i}\right) \vee y=x_{i}\right) \geq t
$$

## First-Order with Some Counting: $\operatorname{FO}(\{>0\})$

## Definition of FO $(\{>0\})$ (Dreier, Rossmanith, '21)

Built recursively using

- the rules of FO
- $\# y \varphi\left(y, x_{1}, \ldots, x_{k}\right) \geq m \quad$ for every $m \in \mathbb{N}$ and $\mathrm{FO}(\{>0\})$ formula $\varphi$

Fragment of $\mathrm{FO}(\mathbb{P})$ and $\mathrm{FOC}(\mathbb{P})$ (Kuske, Schweikardt '17)

PartDomSet:

$$
\exists x_{1} \ldots \exists x_{k} \# y\left(\bigvee_{1 \leq i \leq k} E\left(y, x_{i}\right) \vee y=x_{i}\right) \geq t
$$

$h$-index:

$$
\text { \#mypaper }(\text { \#otherpaper cite(mypaper, otherpaper) } \geq h) \geq h
$$

## Known Results for $\mathrm{FO}(\{>0\})$

Model-checking of $\mathrm{FO}(\{>0\})$ is hard on forests of depth 4

Known Results for $\mathrm{FO}(\{>0\})$
Model-checking of $\mathrm{FO}(\{>0\})$ is hard on forests of depth 4
Theorem (Dreier, Rossmanith '21)
On classes of bounded expansion, in linear FPT time

1. $(1+\varepsilon)$-approximation of $\mathrm{FO}(\{>0\})$,
2. Exact evaluation of formulas $\exists x_{1} \ldots \exists x_{k} \# y \underbrace{\varphi\left(y, x_{1}, \ldots, x_{k}\right)}_{\text {FO w/o } \#} \geq m$

## Known Results for $\mathrm{FO}(\{>0\})$

Model-checking of $\mathrm{FO}(\{>0\})$ is hard on forests of depth 4

## Theorem (Dreier, Rossmanith '21)

On classes of bounded expansion, in linear FPT time

1. $(1+\varepsilon)$-approximation of $\mathrm{FO}(\{>0\})$,
2. Exact evaluation of formulas $\exists x_{1} \ldots \exists x_{k} \# y \underbrace{\varphi\left(y, x_{1}, \ldots, x_{k}\right)}_{\text {FO } w / o \#} \geq m$

## Theorem (Dreier, M., Rossmanith '23)

On nowhere dense classes, in almost linear FPT time:
Exact evaluation of formulas $\exists x_{1} \ldots \exists x_{k} \# y \underbrace{\varphi\left(y, x_{1}, \ldots, x_{k}\right)}_{\text {quantifier-free }} \geq m$
$\Rightarrow$ PartDomSet in (almost) linear FPT time on bounded expansion \& nowhere dense

## Other variants

## Red Blue Partial Dominating Set

Input: $\quad$ A graph $G$ and $k, t_{\text {red }}, t_{\text {blue }} \in \mathbb{N}$
Problem: Are there $k$ vertices dominating $\geq t_{\text {red }}$ red and $\geq t_{\text {blue }}$ blue vertices? Parameter: $k$

## Other variants

## Red Blue Partial Dominating Set

Input: $\quad$ a graph $G$ and $k, t_{\text {red }}, t_{\text {blue }} \in \mathbb{N}$
Problem: Are there $k$ vertices dominating $\geq t_{\text {red }}$ red and $\geq t_{\text {blue }}$ blue vertices? Parameter: $k$

## Exact Partial Dominating Set

Problem: Are there $k$ vertices dominating exactly $t$ vertices?

## Other variants

## Red Blue Partial Dominating Set

Input: $\quad$ A graph $G$ and $k, t_{\text {red }}, t_{\text {blue }} \in \mathbb{N}$
Problem: Are there $k$ vertices dominating $\geq t_{\text {red }}$ red and $\geq t_{\text {blue }}$ blue vertices? Parameter: $k$
$G \models \exists x_{1} \ldots \exists x_{k} \# y \operatorname{Red}(y) \wedge \operatorname{dom}(y, \bar{x}) \geq t_{\text {red }} \wedge \# y \operatorname{Blue}(y) \wedge \operatorname{dom}(y, \bar{x}) \geq t_{\text {blue }}$

## Exact Partial Dominating Set

Problem: Are there $k$ vertices dominating exactly $t$ vertices?
$G \models \exists x_{1} \ldots \exists x_{k} \# y \operatorname{dom}\left(y, x_{1}, \ldots, x_{k}\right)=t$

## Other variants

## Red Blue Partial Dominating Set

Input: $\quad A$ graph $G$ and $k, t_{\text {red }}, t_{\text {blue }} \in \mathbb{N}$
Problem: Are there $k$ vertices dominating $\geq t_{\text {red }}$ red and $\geq t_{\text {blue }}$ blue vertices? Parameter: k
$G \models \exists x_{1} \ldots \exists x_{k} \# y \operatorname{Red}(y) \wedge \operatorname{dom}(y, \bar{x}) \geq t_{\text {red }} \wedge \# y \operatorname{Blue}(y) \wedge \operatorname{dom}(y, \bar{x}) \geq t_{\text {blue }}$

## Exact Partial Dominating Set

Problem: Are there $k$ vertices dominating exactly $t$ vertices?
$G \models \exists x_{1} \ldots \exists x_{k} \# y \operatorname{dom}\left(y, x_{1}, \ldots, x_{k}\right)=t$
Cannot be expressed as $\exists x_{1} \ldots \exists x_{k} \# y \underbrace{\varphi\left(y, x_{1}, \ldots, x_{k}\right)}_{\text {FO w/o } \#} \geq m$

## Other variants

## Red Blue Partial Dominating Set

Input: $\quad A$ graph $G$ and $k, t_{\text {red }}, t_{\text {blue }} \in \mathbb{N}$
Problem: $\quad$ Are there $k$ vertices dominating $\geq t_{\text {red }}$ red and $\geq t_{\text {blue }}$ blue vertices? Parameter: $k$
$G \models \exists x_{1} \ldots \exists x_{k} \# y \operatorname{Red}(y) \wedge \operatorname{dom}(y, \bar{x}) \geq t_{\text {red }} \wedge \# y \operatorname{Blue}(y) \wedge \operatorname{dom}(y, \bar{x}) \geq t_{\text {blue }}$

## Exact Partial Dominating Set

Problem: Are there $k$ vertices dominating exactly $t$ vertices?
$G \models \exists x_{1} \ldots \exists x_{k} \# y \operatorname{dom}\left(y, x_{1}, \ldots, x_{k}\right)=t$
Our goal: Lift result to $\exists x_{1} \ldots \exists x_{k} \bigvee \bigwedge\left(\# y \varphi_{i}(y \bar{x}) \geq m_{i}\right)$
boolean combination of $\ell$ counting terms

## Our Results

## Algorithmic Result

## Theorem (Our Positive Result)

On classes of bounded expansion, we can decide in time $f(k, \ell) n^{\ell+1}$ polylog $n$ whether

$$
G \models \exists x_{1} \ldots \exists x_{k} \mathbf{P}(\# y \underbrace{\varphi_{1}(y \bar{x})}_{F O \text { w/o } \#}, \ldots, \# y \varphi_{\ell}(y \bar{x}))
$$

where $\mathbf{P}$ is some efficiently computable predicate over $\mathbb{N}^{\ell}$.
Moreover, we can count the number of such solutions.

## Algorithmic Result

## Theorem (Our Positive Result)

On classes of bounded expansion, we can decide in time $f(k, \ell) n^{\ell+1}$ polylog $n$ whether

$$
G \models \exists x_{1} \ldots \exists x_{k} \mathbf{P}(\# y \underbrace{\varphi_{1}(y \bar{x})}_{F O \text { w/o } \#}, \ldots, \# y \varphi_{\ell}(y \bar{x}))
$$

where $\mathbf{P}$ is some efficiently computable predicate over $\mathbb{N}^{\ell}$.
Moreover, we can count the number of such solutions.
$\Longrightarrow$ Exact Partial Dominating Set in time $f(k) n^{2}$ on bounded expansion.
$\Longrightarrow$ Red Blue Partial Dominating Set in time $f(k) n^{3}$ on bounded expansion (can be improved to $f(k) n^{2}$ ).

## From k-Sum to Lower Bounds

$k$-Sum Problem: given $m$ numbers $x_{1}, \ldots, x_{m}$; target $T$
Find $k$ numbers that add up to exactly $T$
Algorithms known for $k$-SUM: $\bullet \widetilde{O}(T m) \bullet O\left(m^{\lceil k / 2\rceil}\right)$

## From k-Sum to Lower Bounds

$k$-Sum Problem: given $m$ numbers $x_{1}, \ldots, x_{m}$; target $T$
Find $k$ numbers that add up to exactly $T$
Algorithms known for $k$-SUM: • $\widetilde{O}(T m) \bullet O\left(m^{\lceil k / 2\rceil}\right)$
Theorem (Abboud et al. '21)
For every $\varepsilon>0, k$-SUM is not in time $T^{1-\varepsilon} m^{o(k)}$ (under SETH).

## From k-Sum to Lower Bounds

$k$-Sum Problem: given $m$ numbers $x_{1}, \ldots, x_{m}$; target $T$
Find $k$ numbers that add up to exactly $T$
Algorithms known for $k$-SUM: • $\widetilde{O}(T m) \bullet O\left(m^{\lceil k / 2\rceil}\right)$

## Theorem (Abboud et al. '21)

For every $\varepsilon>0, k$-SUM is not in time $T^{1-\varepsilon} m^{o(k)}$ (under SETH).

## Theorem (Our Lower Bound)

On star forests, for formulas of the form
$\exists x_{1} \ldots \exists x_{k}\left(\# y \varphi_{1}\left(y, x_{1} \ldots x_{k}\right)=t_{1} \wedge \cdots \wedge \# y \varphi_{\ell}\left(y, x_{1} \ldots x_{k}\right)=t_{\ell}\right)$
there is no model-checking algorithm in time $f(k, \ell) n^{\ell-\varepsilon}$, for any function $f$ or $\varepsilon>0$.

## Reduction

Example: $T=100 ; k=3$
$x_{1}=32$,
$x_{2}=42$,
$x_{3}=53$,
$x_{4}=15$.

Reduction to model-checking of our fragment (on star forests):

## Reduction

Example: $T=100 ; k=3$
$x_{1}=32$,

$$
x_{2}=42
$$

$$
x_{3}=53,
$$

$$
x_{4}=15 .
$$

Reduction to model-checking of our fragment (on star forests):


## Reduction

Example: $T=100 ; k=3$
$x_{1}=32$,
$x_{2}=42$,
$x_{3}=53$,
$x_{4}=15$.

Reduction to model-checking of our fragment (on star forests):

$G \models \exists x_{1} \exists x_{2} \exists x_{3} \# y \operatorname{Red}(y) \wedge \operatorname{dom}(y, \bar{x})=9 \wedge \# y \operatorname{Blue}(y) \wedge \operatorname{dom}(y, \bar{x})=10$

## Conclusion

Our results: Model-checking of $\mathrm{FO}(\mathbb{P})$ formulas

$$
G \vDash \exists x_{1} \ldots \exists x_{k} \mathbf{P}(\# y \underbrace{\varphi_{1}(y \bar{x})}_{\text {first-order }}, \ldots, \# y \varphi_{\ell}(y \bar{x}))
$$

on classes of bounded expansion

- in time $f(k, \ell) n^{\ell+1}$ polylog $n$
- not in time $f(k, \ell) n^{\ell-\varepsilon}$ for all $\varepsilon>0$ under SETH

Outlook:

- Close the gaps
- Lift to (structurally) nowhere dense classes



## Appendix

## Partial Dominating Set

## PartDomset

Input: $\quad$ A graph $G$ and $k, t \in \mathbb{N}$
Problem: Are there $k$ vertices dominating $\geq t$ vertices?
Parameter: k

## Partial Dominating Set

## PartDomSet

Input: $\quad$ A graph $G$ and $k, t \in \mathbb{N}$
Problem: Are there $k$ vertices dominating $\geq t$ vertices?
Parameter: k

- DomSet: $\exists x_{1} \ldots x_{k} \forall y\left(\bigvee E\left(y, x_{i}\right) \vee y=x_{i}\right)$
- PartDomSet cannot be expressed as an short FO-formula (requires $\exists y_{1} \ldots \exists y_{t}$ )


## Partial Dominating Set

## PartDomSet

Input: $\quad$ A graph $G$ and $k, t \in \mathbb{N}$
Problem: Are there $k$ vertices dominating $\geq t$ vertices?
Parameter: $k$

- DomSet: $\exists x_{1} \ldots x_{k} \forall y\left(\bigvee E\left(y, x_{i}\right) \vee y=x_{i}\right)$
- PartDomSet cannot be expressed as an short FO-formula (requires $\exists y_{1} \ldots \exists y_{t}$ )
- W[1]-hard for 2-degenerate graphs
- Can be solved on $H$-minor free graphs in time $(g(H) k)^{k} n^{O(1)}$
- Can be solved on classes $\mathcal{C}$ of bounded expansion in time $f_{\mathcal{C}}(k) n$
- Can be solved on nowhere dense classes $\mathcal{C}$ in time $f_{\mathcal{C}}(k) n^{1+\varepsilon}$


## Step 1: Reduction to a Simpler Problem



For all $\bar{u}=u_{1} \ldots u_{k} \in V(G)^{k}$ :
$G \models \quad \# y \varphi_{1}(y \bar{u}) \geq t_{1}$

$$
\begin{gathered}
c_{1}\left(u_{1}\right)+\cdots+c_{1}\left(u_{k}\right) \geq t_{1} \\
\vdots \\
c_{\ell}\left(u_{1}\right)+\cdots+c_{\ell}\left(u_{k}\right) \geq t_{\ell} \\
\vec{G} \models \omega(\bar{u}) \text { (quantifier-free) }
\end{gathered}
$$

## Courcelle with Semiring Homomorphisms

Often don't want one satisfying assignment but computing a property of the set of satisfying assignments

Example: Set of all vertex covers $\mapsto$ minimum weight VC, number of VCs, all VCs...

## Courcelle with Semiring Homomorphisms

Often don't want one satisfying assignment but computing a property of the set of satisfying assignments

Example: Set of all vertex covers $\mapsto$ minimum weight VC, number of VCs, all VCs...

## Definition

A problem $P$ is an MSO-evaluation problem if it can be expressed as computing $h(\operatorname{sat}(\varphi, G))$ for some homomorphism $h$ into a semiring and MSO-formula $\varphi$.

Example: min. weight VC: $(\mathbb{R} \cup\{\infty\}$, min $,+, \infty, 0)$, $h$ maps set to sum of weights

## Courcelle with Semiring Homomorphisms

Often don't want one satisfying assignment but computing a property of the set of satisfying assignments

Example: Set of all vertex covers $\mapsto$ minimum weight VC, number of VCs, all VCs...

## Definition

A problem $P$ is an MSO-evaluation problem if it can be expressed as computing $h(\operatorname{sat}(\varphi, G))$ for some homomorphism $h$ into a semiring and MSO-formula $\varphi$.

Example: min. weight VC: $(\mathbb{R} \cup\{\infty\}$, min $,+, \infty, 0)$, $h$ maps set to sum of weights

## Theorem (Courcelle, Mosbah '93)

An MSO-evaluation problem $P$ can be solved in time $f_{P}(t w)$ nt on graphs of treewidth tw where $t$ is the time complexity of the semiring operations.

## kSum

$k$-Sum Problem: given $m$ numbers $x_{1}, \ldots, x_{m}$; target $T$
Find $k$ numbers that add up to exactly $T$
Algorithms known for $k$-SUM: • $\widetilde{O}(T m) \bullet O\left(m^{\lceil k / 2\rceil}\right)$

## kSum

$k$-Sum Problem: given $m$ numbers $x_{1}, \ldots, x_{m}$; target $T$
Find $k$ numbers that add up to exactly $T$
Algorithms known for $k$-SUM: • $\widetilde{O}(T m) \bullet O\left(m^{\lceil k / 2\rceil}\right)$
Theorem (Abboud et al. '21)
For every $\varepsilon>0, k$-SUM is not in time $T^{1-\varepsilon} m^{o(k)}$ (under SETH).

## Reduction

Example: $T=100 ; k=3$
$x_{1}=32, \quad x_{2}=42, \quad x_{3}=53, \quad x_{4}=15$.
Reduction to model-checking of our fragment (on star forests):

## Reduction

Example: $T=100 ; k=3$
$x_{1}=32$,

$$
x_{2}=42
$$

$$
x_{3}=53,
$$

$$
x_{4}=15 .
$$

Reduction to model-checking of our fragment (on star forests):


## Reduction

Example: $T=100 ; k=3$
$x_{1}=32$,
$x_{2}=42$,
$x_{3}=53$,
$x_{4}=15$.

Reduction to model-checking of our fragment (on star forests):

$G \models \exists x_{1} \exists x_{2} \exists x_{3} \# y \operatorname{Red}(y) \wedge \operatorname{dom}(y, \bar{x})=9 \wedge \# y \operatorname{Blue}(y) \wedge \operatorname{dom}(y, \bar{x})=10$

## Reduction: Parameters

## Theorem (Reminder)

For every $\varepsilon>0, k$-SUM is not in time $T^{1-\varepsilon} m^{o(k)}$ (under SETH).
In our example: Parameter $\ell=2$, size $|G| \leq 2 \sqrt{T} m$.
$\Longrightarrow$ quadratic lower bound for model-checking

## Reduction: Parameters

## Theorem (Reminder)

For every $\varepsilon>0, k$-SUM is not in time $T^{1-\varepsilon} m^{\circ(k)}$ (under SETH).
In our example: Parameter $\ell=2$, size $|G| \leq 2 \sqrt{T} m$.
$\Longrightarrow$ quadratic lower bound for model-checking
In general: $\ell$ freely choosable $\Longrightarrow|G|=O(\sqrt[\ell]{T} \ell m)$
Have to "guess carry-overs": only $f(k, \ell)$ many choices

## Theorem (Our Lower Bound)

On star forests, for formulas of the form
$\exists x_{1} \ldots \exists x_{k}\left(\# y \varphi_{1}\left(y, x_{1} \ldots x_{k}\right)=t_{1} \wedge \cdots \wedge \# y \varphi_{\ell}\left(y, x_{1} \ldots x_{k}\right)=t_{\ell}\right)$
there is no model-checking algorithm in time $f(k, \ell) n^{\ell-\varepsilon}$, for any function $f$ or $\varepsilon>0$.

