# Optimal Data Reduction for Graph Coloring Using Low-Degree Polynomials

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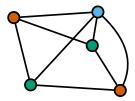
## The q-Coloring problem

Can the vertices of a graph be colored with at most q colors?

NP-hard, use a parameterized approach

Which parameter(s)?

- Number of colors
  - Uninteresting
- Structural parameters
  - In this talk: Vertex Cover
- Number of vertices (sparsification)



#### Previous work

- ► Fiala et al.: coloring problems parameterized by
  - Vertex Cover vs. Treewidth
- ► Jansen and Kratsch: parameter hierarchy for graph coloring

Jansen and Kratsch [Inf Comput. 2013] showed that

- q-Coloring parameterized by VC has a kernel of bitsize  $O(k^q)$
- ▶ But no kernel of size  $O(k^{q-1-arepsilon})$  for  $q \geq 4$  unless NP  $\subseteq$  coNP/poly

Jansen and P. [Algorithmica 2017]

• q-Coloring for  $q \ge 4$  has no non-trivial sparsification

Open problems

- ▶ Factor *k*-gap between upper- and lower bound
- Sparsification bound for q = 3

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#### Theorem

*q*-Coloring parameterized by Vertex Cover has a kernel with  $O(k^{q-1})$  vertices and bitsize  $O(k^{q-1} \log k)$ .

#### Theorem

3-Coloring with n vertices has no kernel of bitsize  $O(n^{2-\varepsilon})$ , unless NP  $\subseteq$  coNP/poly.

Consequently,

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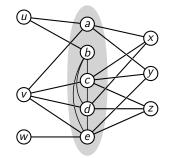
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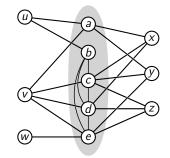
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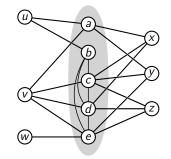
- ▶ IS may be large compared to VC
- Find redundant vertices in IS
  - Any coloring of G u can be extended to G
- Example for 3-coloring: *u* and *w* 
  - Degree smaller than q
- Similarly, find redundant edges



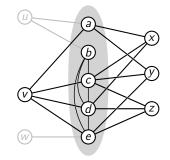
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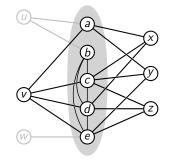
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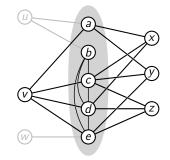
We have graph G, with vertex cover VCThe remaining vertices form independent set IS

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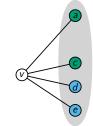
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Vertices in IS can be colored independently

- Each vertex in IS corresponds to a constraint
  - Neighborhood does not use all q colors
- Gives constraints on the coloring of VC
  - If some coloring of VC satisfies all constraints, it can be extended to IS

Alternatively, if for all  $S \subseteq N(v)$  with |S| = q



coloring can be extended to v

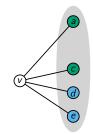


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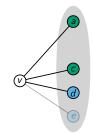
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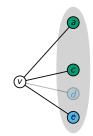
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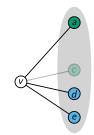
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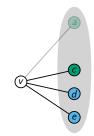
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### Finding redundant constraints

Let L be a set of polynomial equalities of degree at most d, over n boolean variables.

$$L = \{ x_1 x_2 + x_2 x_3 + x_4 \equiv_2 0 \\ x_1 + 1 \equiv_2 0 \\ x_3 x_1 + 1 \equiv_2 0 \\ \dots \\ \}$$

#### Theorem [Jansen and P. MFCS 2016]

There is a polynomial-time algorithm that outputs  $L' \subseteq L$ , s.t.

An assignment satisfies L if and only if it satisfies L' and

$$\blacktriangleright |L'| \le n^d + 1$$

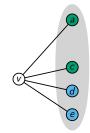
### Modeling vertices as constraints

Polynomial equalities

- Create *q* boolean variables for each vertex in VC.
  - $C_{v,i}$  denotes whether vertex v has color i
- For each vertex v in IS,  $S \subseteq N(v)$  with |S| = q
  - Constraint: *S* does not use all *q* colors.

Which polynomial to use?

• Needs to have degree  $\leq q-1$ 



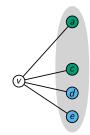
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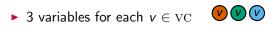
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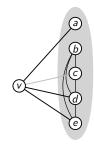
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Let v ∈ IS, for each S ⊆ N(v) : |S| = q
Polynomial equality of degree 2
For S = {a, d, e}:

 $(a) \wedge (d) + (a) \wedge (e) + (d) \wedge (e) + (a) \wedge (e) + (d) \wedge (e) + (a) \wedge (e) + (d) \wedge (e) \equiv_2 1$ 



- Three equal colors gives  $3 \equiv_2 1$
- Two equal colors gives 1
- Three different colors gives 0
- Also exists for q-Coloring

▶ 3 variables for each  $v \in VC$   $\heartsuit \heartsuit \heartsuit \heartsuit$ 

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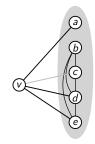
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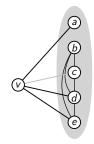
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Expresses: a,d, and e do not use all 3 colors

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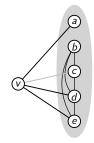
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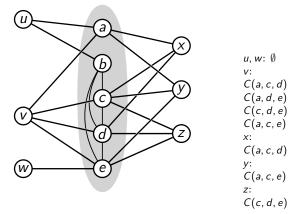
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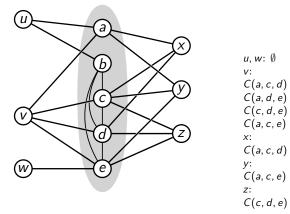
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#### Model vertices in IS by constraints

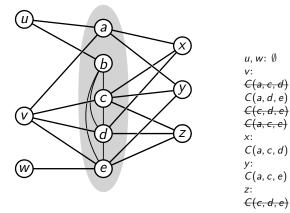
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- Keep only vertices and edges used for relevant constraints



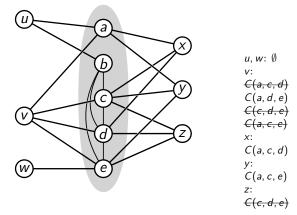
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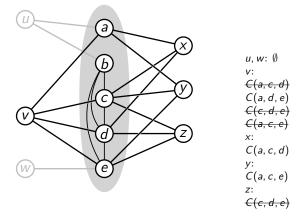
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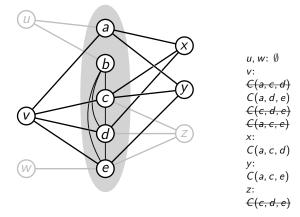
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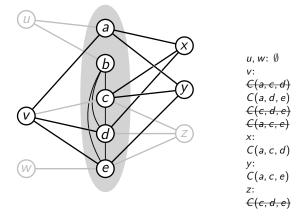
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### Kernel size

- Number of constraints O(#vars<sup>degree</sup>)
  - $q \cdot k$  variables
  - degree q-1
- Number of constraints  $O((qk)^{q-1})$
- ▶ Constraint corresponds to ≤ 1 vertex and ≤ *q* edges
- ▶ Encode graph in *O*(*k*<sup>*q*−1</sup> log *k*) bits for *q* fixed

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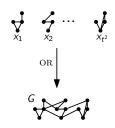
# Sparsification lower bound

### Lower bound

We show that 3-Coloring has no kernel of size  $O(|V(G)|^{2-\varepsilon})$ 

### Degree-2 cross-composition

- Start from NP-hard problem Q
  - ► Choose *Q* carefully
- Give a polynomial-time algorithm:
- Input:  $t^2$  similar instances of Q
- Output: Instance G s.t.
  - $|V(G)| = O(t \cdot \max |x_i|^c)$
  - G is 3-colorable if and only if at least one of the inputs a yes-instance



### Starting problem

#### Restricted Coloring with Triangle Split Decomposition

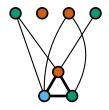
[Jansen and P. Algorithmica 2017]

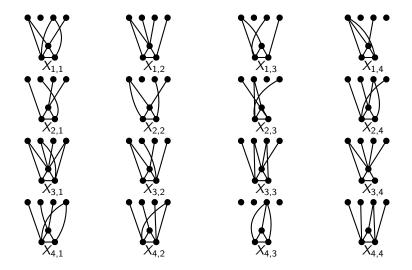
Input: graph G with partitioning of the vertices  $V(G) = S \cup T$ 

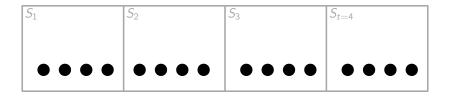
- ► S is an independent set in G
- ▶ *G*[*T*] is a disjoint union of triangles

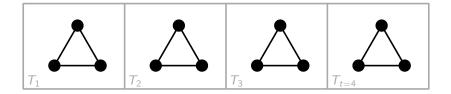
Question: Is there a proper 3-coloring of G (using red,green,blue), such that no vertex in S is colored blue?

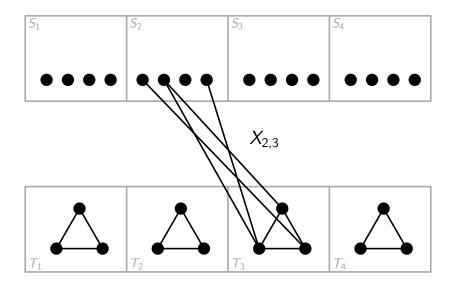
We call this a restricted coloring

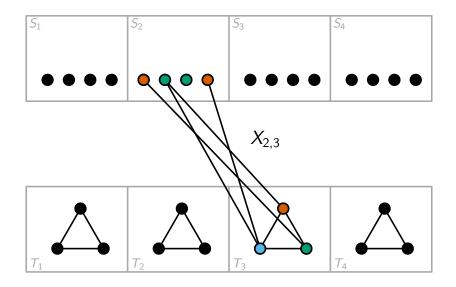


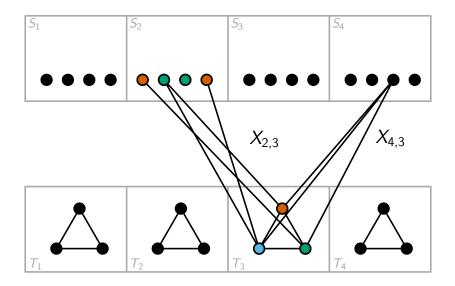


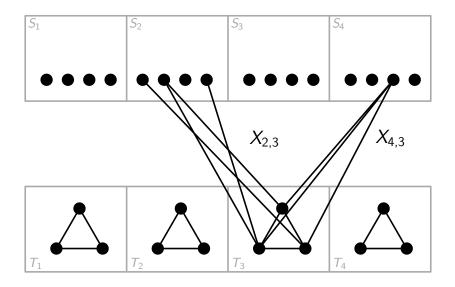


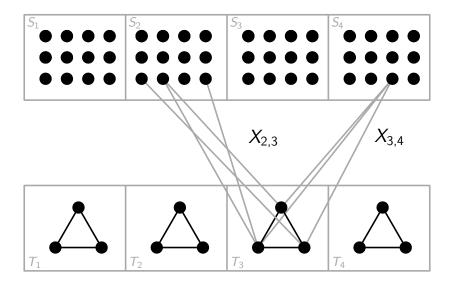


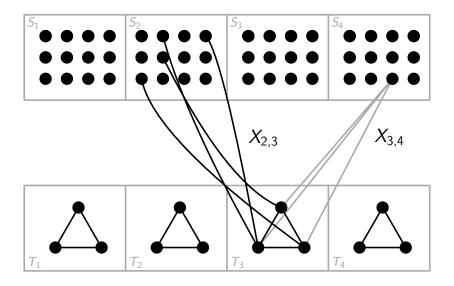


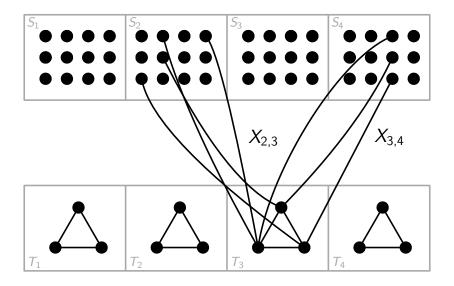


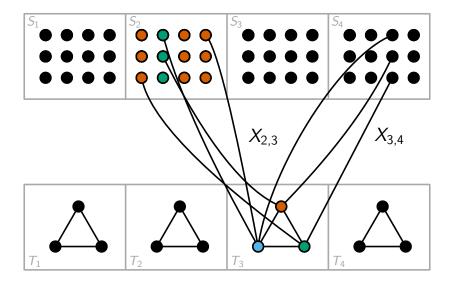


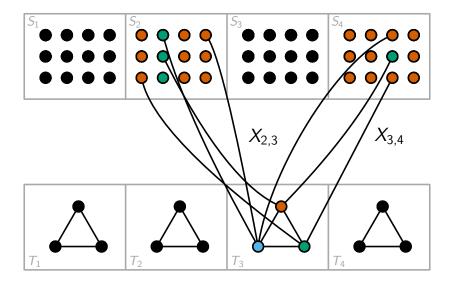


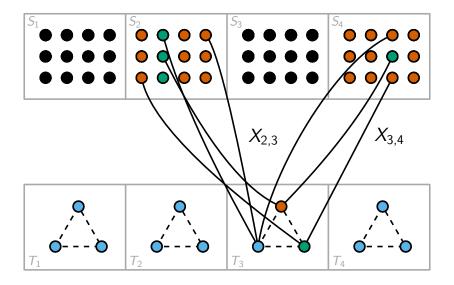












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#### Techniques

- Finding redundant constraints applied to graph problem
- Method of copying vertices for cross-composition

Future work

- Exact kernel bounds for q-Coloring with other parameters
  - Modulator to cograph

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### Polynomial for *q*-Coloring

For 3-Coloring:

$$a \wedge d + a \wedge e + d \wedge e + d \wedge e + d \wedge a + e \wedge a + e \wedge d \equiv_2 0$$

Formula:

 $y_{1,1} \cdot y_{2,2} + y_{1,1} \cdot y_{3,2} + y_{2,1} \cdot y_{1,2} + y_{2,1} \cdot y_{3,2} + y_{3,1} \cdot y_{1,2} + y_{3,1} \cdot y_{2,2} \equiv_2 0$ In general:

$$\sum_{\substack{i_1,\ldots,i_{q-1}\in[q]\\\text{distinct}}}\prod_{k=1}^{q-1}y_{i_k,k}\equiv_2 0$$