

Conflict Graphs for Combinatorial Optimization Problems

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joint work with Andreas Darmann and Joachim Schauer

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Introduction	Knapsack Problem	KCG on Trees	Chordal Graph	FPTAS	MST
Introduc	tion				

Combinatorial Optimization Problem CO

Consider any CO with decision variables $x_j \in \{0, 1\}$, $j \in V$, and a feasible domain $x \in S$.

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Combinatorial Optimization Problem CO

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Conflict Structure

Add disjunctive constraints for some pairs of variables:

$$x_i + x_j \leq 1$$
 for $(i, j) \in E \subset V \times V$

 \implies at most one of the two variables i, j can be set to 1.

Representation by a **conflict graph** G = (V, E)Edges in G connect conflicting variables of CO.

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Relation to Independent Set (IS)

Feasible domain for CO problem with a conflict graph: Intersection of S with an independent / stable set problem in G

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Introduction							

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Relation to Independent Set (IS)

Feasible domain for CO problem with a conflict graph: Intersection of S with an independent / stable set problem in G

Complexity

IS is already strongly \mathcal{NP} -hard, no constant approximation ratio \implies adding an IS condition makes CO (much) more difficult.

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Introduction

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IS is already strongly \mathcal{NP} -hard, no constant approximation ratio \implies adding an IS condition makes CO (much) more difficult.

One main direction of research:

Identify special graph classes for the conflict graph G such that the considered CO problem

- is polynomially solvable
- permits a (fully) polynomial approximation scheme
- has a constant approximation ratio

Conflict Graphs: Bin Packing

Conflicting items must be in different bins

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- Jansen, Öhring '97: 5/2- resp. 2 + ε-approximation for special graph classes; improved by Epstein, Levin '06 (also on-line)
- Epstein et al.'08: extension to two dimensional packing of squares
- Jansen '99: A-FPTAS for special graph classes
- e.g.: perfect, bipartite, interval, *d*-inductive graphs.

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- e.g.: perfect, bipartite, interval, d-inductive graphs.
- Gendreau et al.'04: heuristics and lower bounds
- Malaguti et al.'07: hybrid tabu search
- Malaguti et al.'08: exact algorithm (branch-and-price)

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Conflict Graphs: Scheduling

Mutual Exclusion Scheduling

Schedule unit-length jobs on m machines, conflicting jobs not to be executed in the same time interval.

Baker, Coffman '96; Bodlaender, Jansen '93; polynomially solvable special cases, special graph classes.

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Scheduling with Incompatible Jobs

Conflicting jobs not to be executed on the same machine.

Bodlaender, Jansen, Woeginger '94: approximation algorithms for special graph classes.

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Knapsack Problem with Conflict Graph (KCG)

Vertices (=items) adjacent in G cannot be packed together in the knapsack!

ILP-Formulation

(KCG) max
$$\sum_{j=1}^{n} p_j x_j$$

s.t.
$$\sum_{j=1}^{n} w_j x_j \leq c$$

 $(i,j) \in E \Longrightarrow x_i + x_j \leq 1$
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Introduce upper bound *P* on optimal solution, e.g. $P := \sum_{j=1}^{n} p_j$

Note: Classical Greedy algorithm can perform as bad as possible!

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Literature on KCG

Exact Algorithms and Heuristics

• Yamada et al. '02: introduce the problem, present heuristic and exact algorithms (based on Lagrangean relaxation)

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no special graph classes considered!

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Knapsack Problem with Conflict Graph (KCG)

Our Goal

Identify special graph classes, where KCG can be solved in pseudo-polynomial time and permits an FPTAS.

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Pseudo-polynomial time algorithms and FPTAS for KCG on:

• Trees

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Pseudo-polynomial time algorithms and FPTAS for KCG on:

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- Chordal Graphs

Idea for KCG on Trees

Basic Observation



Apply Dynamic Programming by Profits ⇒ Scaling yields FPTAS We use Dynamic Programming by Reaching moving bottom up in the conflict tree.

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Apply Dynamic Programming by Profits \implies Scaling yields FPTAS We use Dynamic Programming by Reaching moving bottom up in the conflict tree. For every vertex *i*: Determine the solution of the subproblem defined by the subtree rooted in *i*.

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Notation

 $z_i(d)$ solution with profit d and minimal weight found in the subtree T(i) with item i necessarily **included**.

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Notation

 $z_i(d)$ solution with profit d and minimal weight found in the subtree T(i) with item i necessarily **included**. $y_i(d)$ solution with profit d and minimal weight found in the subtree T(i) with item i **excluded**.



Tree traversed in Depth-First-Search-Order (DFS)







Tree traversed in Depth-First-Search-Order (DFS)



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Algorithmic Details

Tree traversed in Depth-First-Search-Order (DFS)



Vertex r included





Tree traversed in Depth-First-Search-Order (DFS)



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Tree traversed in Depth-First-Search-Order (DFS)





Running time: $O(nP^2)$ Space: O(nP) (trivial version)

















Space Reduction Method

Worst case without reduction: O(nP)



Choosing the left child in every step allocates O(n) storage arrays.

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By choosing the right child vertex, only two arrays would be necessary.

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In general: Space can be reduced to $O(\log n)$ arrays.

Worst-case: Complete binary tree

Space Reduction Method (general)

Property 1. Tree T processed in DFS order with following rule: Take child vertex j, whose subtree contains the largest number of vertices.

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- **Property 2.** Each vertex of T requires O(k) space for processing.
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- **Lemma 1.** An algorithm A fulfilling Properties 1, 2 and 3 uses at most (Id(n) + 1) * O(k) space.

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Lemma 1. An algorithm A fulfilling Properties 1, 2 and 3 uses at most (Id(n) + 1) * O(k) space.

Sketch of Proof. *r* has *k* childs $i_1 \ldots i_k$ so that $|T(i_j)| \le \frac{n}{2}$ and w.l.o.g $|T(i_1)| \ge |T(i_j)|$ for all $j \in \{1 \ldots k\}$: Then the processing of $T(i_1)$ is done by using at most $(\operatorname{Id}(\frac{n}{2}) + 1) * O(k) = \operatorname{Id}(n) * O(k)$ space. After merging this subtree to *r* this space can be deallocated, but O(k) space is used at vertex *r*, which has to be kept until *A* has finished.

Bounded Treewidth

Tree-Decomposition of graph G = (V, E)

Every graph can be represented by a tree whose vertices are subsets of V.

Original graph can be reproduced from the tree-decomposition. E.g. adjacent vertices of G must be jointly contained in at least one subset.

Treewidth: minimal cardinality over all tree-decompositions of the largest subset-1.

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Treewidth

Treewidth indicates "how far is the graph away from a tree".

- trees have treewidth 1
- series parallel graphs have treewidth 2
- . . .

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Nice Tree-Decomposition

For algorithmic purposes, the structure of the decomposition is restricted to four simple configurations.

A nice tree-decomposition with the same treewidth can be computed from a tree-decomposition in O(n) time. [cf. Bodlaender, Koster '08]

Many \mathcal{NP} -hard problems can be solved efficiently for graphs with bounded treewidth. [Bodlaender '97]

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Solving KCG with Bounded Treewidth

Algorithmic Idea

```
Take a nice tree-decomposition T of G
Process T in a DFS way.
```

For every vertex of T (i.e. a subset of V): Consider all independent sets (IS) of all vertices in T explicitly. Note: Number of IS is constant!

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Perform dynamic programming and consider inclusion or exclusion for every IS.

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Time and Space

KCG for conflict graphs of bounded treewidth can be solved in $O(nP^2)$ time and $O(\log n P + n)$ space given a tree-decomposition. The space reduction method of Lemma 1 can be applied again!

Introduction	Knapsack Problem	KCG on Trees	Chordal Graph	FPTAS	MST
Chordal	Graphs				

A Chordal Graph (a.k.a. triangulated graph) does not contain induced cycles other than triangles.

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Solving KCG on Chordal Graphs

Tree Representation

For every chordal graph G there is a clique tree $T = (\mathcal{K}, \mathcal{E})$: maximal cliques K of G are vertices of T for each vertex $v \in G$: all cliques K containing v induce a subtree in T.

cf. [Blair, Peyton '93]

Tree Representation

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cf. [Blair, Peyton '93]

Basic Idea of the Algorithm

The vertices of the clique tree T are complete subgraphs. \implies at most one vertex of each clique can be in the knapsack.

Process T in a DFS way.

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Solving KCG on Chordal Graphs

Dynamic Programming Definition

 $f_d^v(I)$: solution with profit d and minimal weight containing item $v \in I$, while considering in the clique tree only the subtree rooted in I. definition extended to $v = \emptyset$.

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Solving KCG on Chordal Graphs

Vertex R with one (or first) child J



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Solving KCG on Chordal Graphs



Vertex R with one (or first) child J for $v \in R$: if $v \in R \cap J$: {b, c} $f_d^v(R) = f_d^v(J)$ else: {a} $f_d^v(R) = w(v) + min_i \left\{ f_{d-p(v)}^i(J) : i \in (J \setminus R) \cup \emptyset \right\}$

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Vertex R with second child J



for $v \in R$: if $v \in R \cap J$: {a} $f_d^v(R) =$ $\int \min_k \left\{ f_k^v(R) + f_{d-k+p(v)}^v(J) \right\}$ $f_d^v(R) = f_d^v(R) - w(v)$

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Vertex R with second child J



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Vertex R with second child J



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Solving KCG on Chordal Graphs

Running Time

Straightforward: $O(n^4 P^2)$

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Taking a closer look: O(n^2 P^2)
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Space

 $O(n \log n P)$ with space reduction technique!



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Space

 $O(n \log n P)$ with space reduction technique!

Storing Solution Sets (for all three algorithms)

Note: Storing not only solution values but solution sets increases time and space by a factor of n (or log n for bit-encoding).

MST

Solving KCG on Chordal Graphs

Running Time

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Taking a closer look: $O(n^2 P^2)$

Space

 $O(n \log n P)$ with space reduction technique!

Storing Solution Sets (for all three algorithms)

Note: Storing not only solution values but solution sets increases time and space by a factor of n (or log n for bit-encoding).

This can be avoided by applying a general recursive divide and conquer technique (see Pferschy '99).

FPTAS

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Deriving an FPTAS from Dynamic Programming

Scaling

Classical approach of an FPTAS for the knapsack problem: Scale profits:

$$ilde{p}_j = \left(rac{n}{arepsilon p_{\mathsf{max}}}
ight) p_j$$

Running time:

$$n \cdot P \xrightarrow{\text{scaling}} n \cdot \tilde{P} \le n \cdot n \ \tilde{p}_{\max} = n^2 \left(\frac{n}{\varepsilon p_{\max}}\right) p_{\max} = \frac{n^3}{\varepsilon}$$

Induced relative error can be bounded by ε .

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Induced relative error can be bounded by ε .

FPTAS for KCG

Same scaling approach can be applied to all three KCG algorithms. Technical details rather straightforward.
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Minimum Spanning Tree with Conflict Graph (MSTCG)

Problem Description

given:

- a weighted graph H = (V, E, w), conflict graph $C = (E, \overline{E})$ where more
- a conflict graph $G = (E, \overline{E})$ whose *m* vertices correspond uniquely to edges in *E*.

edge $ar{e} = (i,j) \in ar{E} \Longrightarrow$ conflict between the two edges $i,j \in E$

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Problem (MSTCG):

find a minimum spanning tree $T \subseteq E$ of H without conflicts w.r.t. G

Minimum Spanning Tree with Conflict Graph (MSTCG)

Question:

For which type of conflict graph does MSTCG become $\mathcal{NP}\text{-hard}?$

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Minimum Spanning Tree with Conflict Graph (MSTCG)

Question:

For which type of conflict graph does MSTCG become \mathcal{NP} -hard?

Definition

2-ladder: graph whose components are paths of length one.

3-ladder: graph whose components are paths of length two.

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Our Complexity Results

• MSTCG is polynomially solvable if the conflict graph G is a 2-ladder.

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Our Complexity Results

- MSTCG is polynomially solvable if the conflict graph G is a 2-ladder.
- MSTCG is strongly \mathcal{NP} -hard if the conflict graph G is a 3-ladder.

MSTCG with a 2-ladder

Conflict-free Matroid

Subsets of edges NOT containing any conflicting pair define the **conflict-free matroid**:

$$\mathcal{I} := \left\{ E' \subseteq E | \not\exists (e, f) \in \bar{E} : \{e, f\} \subseteq E'
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Note that in a 2-ladder conflicting pairs are independent from each other.

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MSTCG with a 2-ladder

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Note that in a 2-ladder conflicting pairs are independent from each other.

 \implies MSTCG is the intersection of the graphic matroid (MST) with the conflict-free matroid

Matroid Intersection

MSTCG with a 2-ladder can be solved by Edmonds' weighted matroid intersection algorithm in polynomial time.

MST

MSTCG with a 3-ladder

Complexity Result

MSTCG with a 3-ladder is strongly \mathcal{NP} -hard.

MSTCG with a 3-ladder

Complexity Result

MSTCG with a 3-ladder is strongly \mathcal{NP} -hard.

Construction

Reduction from the special case of 3-SAT, where each variable occurs in at most 5 clauses (still \mathcal{NP} -complete).

Construct an instance of MST and a 3-ladder conflict graph as follows:

Introduction Knapsack Problem KCG on Trees Chordal Graph FPTAS MST

MSTCG with a 3-ladder



For every clause, e.g. C_1 , a *fork* represents the three literals.

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MSTCG with a 3-ladder



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FPTAS

For every variable, two gadgets represent x_1 and \bar{x}_1 .

Edges w_{1j}, z_{1j} for the ≤ 5 clauses variable 1 appears in.

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MST

MSTCG with a 3-ladder



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Edges w_{1j}, z_{1j} for the ≤ 5 clauses variable 1 appears in.

Spanning tree: Connection from C_1 to 1 either via x_1 or via w_{10}, \ldots, w_{14} .

edge x_1 in the tree \Leftrightarrow $x_1 = T_1 RUE_{2}, a = 0$

MST

MSTCG with a 3-ladder



Conflict Graph G:

$$(x_1, \bar{x}_1)$$

 (Δ_{11}, g_{11})
 (z_{11}, w_{11}, f_{11})
 $(z_{1j}, w_{1j}, f_{1j}), j = 2, 3, 4$
 (w_{10}, f_{10})

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MST

MSTCG with a 3-ladder



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 (w_{10}, f_{10})

Connect C_1 to 1 in MST: choose $g_{11} \rightarrow f_{11} \Rightarrow$ w_{11} forbidden other w_{1j} : either forbidden or chosen \Rightarrow z_{1j} forbidden \Longrightarrow only connection via x_1

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MST

MSTCG with a 3-ladder



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Connect C_1 to 1 in MST: choose $g_{11} \rightarrow f_{11} \Rightarrow$ w_{11} forbidden other w_{1j} : either forbidden or chosen \Rightarrow z_{1j} forbidden \Longrightarrow only connection via x_1 MST: exactly one edge

 g_{ij} for every clause $j \equiv s_{QQ}$

MSTCG with a 3-ladder

Construction

It can be shown:

There is a truth assignment for a 3-Sat instance with k clauses \Leftrightarrow

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there is a conflict-free spanning tree with weight < k.

MSTCG with a 3-ladder

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It can be shown:

There is a truth assignment for a 3-Sat instance with k clauses \Leftrightarrow

there is a conflict-free spanning tree with weight < k.

Conclusion

Conflicts makes optimization (and life in general) much more difficult.

 \implies try to avoid conflicts whenever possible!

Thank you for your attention!