# **Treewidth computations I. Upper bounds**

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- 1. Motivation
- 2. Elimination Ordering Methods
- 3. Separator Methods
- 4. Results

# Motivation

- 1. Choose infeasible problem
  - Combinatorial Problems
  - Computational Biology
  - Constraint Satisfaction
  - ...
- 2. Find  $FPT_{tw}$  algorithm
- 3. Model problem as graph
- 4. Compute tree composition with small tree width



- 1. Choose infeasible problem
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- 2. Find  $FPT_{tw}$  algorithm
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- 4. Compute tree composition with small tree width
- 5. Tract the intractable



#### We want (efficiently)

- High Lower Bound: Tree dec. not the right tool
- Low Upper Bound: Tree dec. works
- · Other combinations? -- Not so useful

#### What this paper is about

Exact algorithm: Huge constant factor [4]

- $\rightarrow~{\rm Find}$  a non-optimal tree decomposition
- ightarrow This is also an Upper Bound

# **Elimination Ordering Methods**

2. Elimination Ordering Methods

Idea

- Greedy Triangulation
- Local Search (Tabu Search)
- Chordal Graph Recognition

#### **Theorem** [1, 2]

Equivalent:

- (i) G has a treewidth at most k.
- (ii) There is an elimination ordering  $\pi$ , such that no vertex  $v \in V$ has more than k neighbours with a higher number in  $\pi$  in  $G_{\pi}^+$

## Application

- 1. Take some elimination ordering  $\pi$  of G
- 2. Construct  $G_{\pi}^+$ , calculate k
- 3.  $\xrightarrow{(i) \equiv (ii)}$  Upper Bound for treewidth



$$\pi = [A, B, C, D, E]$$



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 $\pi = [A, B, C, D, E]$ 



Input: 
$$G, \pi$$
  
Output:  $G_{\pi}^{+}$   
 $H = G$   
foreach  $v \in V_{G}$  do  
 $\left| \begin{array}{c} \text{foreach } w, x \text{ of } N_{H}(v) \text{ do} \\ | \text{ if } \pi(w), \pi(x) > \pi(v) \text{ then} \\ | \text{ add } \{w, x\} \text{ to } E_{H} \end{array} \right|$   
return  $H$ 

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- $\cdot \ G_{\pi}^+$  is chordal
- $\cdot$  *G* is a subgraph of  $G^+_{\pi}$
- +  $\pi$  is a perfect elimination ordering of  $G_\pi^+$
- width of subtree graph (also a tree decomposition) of  $G_{\pi}^+$ is MAXCLIQUE $(G_{\pi}^+) - 1$  [2]
- There is a tree decomposition algorithm for G with  $width = MAXCLIQUE(G_{\pi}^{+}) - 1$ , polynomial in n [1]

How to find the best elimination ordering?

How to find the best elimination ordering?

Best = 
$$G_{\pi}^+$$
 with Min(MAXCLIQUE( $G_{\pi}^+$ ))  
= Computational Infeasible  
= see [3]

#### How to find the best a good elimination ordering?

No best. But the smaller the triangulation the better. For minimal (not minimum):  $\mathcal{O}(n^{2.376})$  [3]

```
Input: G(V, E)

Output: \pi

H = G

for i = 1 to n do

Choose v \in H by criteria X

Set \pi^{-1}(i) = v

Eliminate v from H (make N_H(v) a clique and remove v)

return H
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How to choose X?

## Minimum Degree/Greedy Degree

X = v with smallest degree in H

Performs well in practice

## **Greedy Fill In**

X = v which causes smallest number of fill edges in  $G_{\pi}^+$ = v with smallest number of pairs of non-adjacent neighbours

Slightly slower, slightly better bounds than MD/GD on average

#### **Lower Bound Based**

Eliminate v from H, compute lower bound (LB) of treewidth Choose v with  ${\rm Min}(2*LB+\deg_H(v))$ 

#### **Enhanced Minimum Fill In**

Compute LB of GChoose simplical or almost simplical v with  $\deg(v)$  at most LB otherwise: Greedy Fill In

•••

## Tabu Search

#### **General Approach**

- (i) Keep list of  $\alpha$  last solutions to avoid cycling
- (ii) Find inital solution [= some elimination ordering]
- (iii) Make small change to get Neighbourhood
- (iv) Select neighbouring solution  $\notin \alpha$  with smallest cost
- (v) Repeat (iii), (iv) some time  $\rightarrow$  return best solution

#### **Neighbourhood Generation**

Swap two vertices in elminiation ordering

#### Step Cost

- (i) Width of generated neighbour
- (ii) But many neighbours with equal width, better:

 $\rightarrow w_{\pi} * n^2 + \sum v \in V |N_{\pi}^+(v)|^2$ 

If it's chordal already, find perfect elminiation ordering (i.e. recognize it):

- Maximum Cardinality Search
- Lexicographical Breadth First Search

... tree decomposition depends on (perfect) elimination ordering found. Mostly determined by algorithms, except for first chosen  $v_n$  (from right to left).

- $\rightarrow$  try for all v
- ightarrow adds factor  $\mathcal{O}(n)$

# **Separator Methods**

- 3. Separator Methods
  - Minimum Separating Vertex Set Heuristic
  - Other Algorithms

# Minimum Separating Vertex Set Heuristic



# Minimum Separating Vertex Set Heuristic



Choose  $i \in I$  such that  $|X_i|$  maximal and  $G[X_i]$  does not include a clique.

## **Minimum Separating Vertex Set Heuristic**



Construct Graph  $H_i$ :

 $H_i(X_i, E_{H_i}), E_{H_i} = \{\{v, w\} \in X_i \times X_i | \{v, w\} \in E \lor \exists j \neq i : v, w \in X_j\}$ Compute minimum separator  $S; W_1, \ldots, W_r$  are components Construct new tree decomposition

- MinimalTriangulation (same principle as Minimum Separating Vertex Set Heuristic)
- Component Splitting

# Results

# **Greedy Results**

- Average of 50 randomly generated graphs
- Combinations of GreedyFillIn, GreedyDegree, Triangulation Minimisation
- Best Results for combinations with Triangulation Minimisation
- Worst Results for GreedyFillIn alone
- GreedyDegree is fast and perfoming well



Figure 1: Results for Greedy Heuristics [1]

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