# Computing treewidth via exact and heuristic lists of minimal separators 

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## Overview of the approach: three components

## $\operatorname{msDP}(G, k, \Delta)$

$G$ : graph
$k$ : positive integer,
$\Delta$ : a set of minimal separators of $G$
Decides if $G$ has a tree-decomposition of width $\leq k$ that uses minimal separators only from $\Delta$
listExact $(G, k)$
Generates $\Delta_{k}(G)$, the set of all minimal separators of cardinality $\leq k$ listHeuristic $(G, T, k)$
$T$ : a tree decomposition of $G$
Iteratively generates expanding subsets

$$
\Delta^{0} \subset \Delta^{1} \subset \Delta^{2} \subset \Delta^{3} \ldots \subseteq \Delta_{k}(G)
$$

## Three algorithms for computing the treewidth of $G$

## Ascend

for $k$ ascending from a trivial lower bound:
decide if $t w(G) \leq k$ by calling $\operatorname{msDP}(G, k$, listExact $(G, k))$
if YES then stop
Descend
$T$ := heuristic tree-decomposition of $G$ by a greedy heuristic heuristically improve $T$ as log as possible
to improve $T$ of width $w$, use listHeuristic $(G, T, w-1)$ to generate

$$
\Delta^{0} \subset \Delta^{1} \subset \Delta^{2} \subset \Delta^{3} \ldots \subseteq \Delta_{w-1}(G)
$$

and try $\operatorname{msDP}\left(G, k, \Delta^{i}\right)$ for $i=0,1,2, \cdots$
try to show $T$ of width $w$ is optimal by $\operatorname{msDP}(G, w-1, \operatorname{listExact}(G, w-1))$
Alternate
Alternate between Descend and Ascend, with some resource balancing

## Random instances

| $\checkmark$ | $\|E\|$ | tw | $\left\|\Delta_{t w-1}\right\|$ | FI1 | $\Delta_{t w}$ | FI | $V \mid$ | E | tw | $\Delta_{t w-1}$ | FI1 | $\Delta_{t w}$ | FI |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 40 | 120 | 14 | 1021 | 912 | 2356 | 2080 | 70 | 210 | 22 | 299681 | 227030 | 786777 | 602892 |
| 40 | 160 | 18 | 1640 | 1344 | 3952 | 3289 | 70 | 280 | 28 | 498944 | 412612 | 1137482 | 930417 |
| 40 | 200 | 20 | 875 | 735 | 1790 | 1502 | 70 | 350 | 33 | 590136 | 464161 | 1291834 | 1006981 |
| 40 | 240 | 22 | 812 | 667 | 1861 | 1615 | 70 | 420 | 37 | 472728 | 386375 | 991158 | 797858 |
| 40 | 280 | 24 | 631 | 518 | 1275 | 1103 | 70 | 490 | 38 | 106296 | 85958 | 203148 | 61982 |
| 40 | 320 | 25 | 342 | 296 | 626 | 521 | 70 | 560 | 42 | 150427 | 122423 | 293595 | 235726 |
| 40 | 360 | 27 | 292 | 246 | 579 | 474 | 70 | 630 | 45 | 150442 | 117591 | 304528 | 233298 |
| 40 | 400 | 28 | 232 | 203 | 469 | 405 | 70 | 700 | 47 | 101673 | 79286 | 205276 | 158689 |
| 50 | 150 | 16 | 3895 | 3565 | 9152 | 8099 | 80 | 240 | 25 | 1621664 | 1424712 | 4081263 | 3503941 |
| 50 | 200 | 20 | 3772 | 3377 | 7878 | 6956 | 80 | 320 | 31 | 2284149 | 1936667 | 5189162 | 4362765 |
| 50 | 250 | 24 | 5127 | 4397 | 10555 | 8949 | 80 | 400 | 35 | 988166 | 827068 | 2065839 | 1710869 |
| 50 | 300 | 26 | 2788 | 2299 | 5345 | 4417 | 80 | 480 | 39 | 751344 | 622050 | 1481223 | 1208020 |
| 50 | 350 | 29 | 3437 | 2682 | 6685 | 5293 | 80 | 560 | 42 | 458205 | 373407 | 872193 | 700485 |
| 50 | 400 | 31 | 2302 | 1766 | 4512 | 3586 | 80 | 640 | 46 | 608006 | 489690 | 1181883 | 934389 |
| 50 | 450 | 32 | 1163 | 945 | 2089 | 1656 | 80 | 720 | 49 | 471433 | 379049 | 896693 | 706639 |
| 50 | 500 | 34 | 1048 | 889 | 1987 | 1638 | 80 | 800 | 52 | 438636 | 355371 | 846794 | 671334 |
| 60 | 180 | 18 | 11698 | 9238 | 26313 | 22416 | 90 | 270 | 27 | 7947239 | 5585295 | 19521897 | 13560016 |
| 60 | 240 | 22 | 12743 | 10540 | 27052 | 21984 | 90 | 360 | 35 | 30498292 | 25231339 | 71039889 |  |
| 60 | 300 | 27 | 27359 | 20595 | 56991 | 41584 | 90 | 450 | 40 | 24205797 | 18839873 | 51925771 |  |
| 60 | 360 | 30 | 17956 | 13829 | 34793 | 26356 | 90 | 540 | 45 | 19877659 | 15311306 | 41166209 | 31119888 |
| 60 | 420 | 33 | 17281 | 13843 | 33755 | 26586 | 90 | 630 | 49 | 11958408 | 9812327 | 23932551 |  |
| 60 | 480 | 34 | 5862 | 4789 | 10320 | 8248 | 90 | 720 | 52 | 7106240 | 5573022 | 13888202 | 10716600 |
| 60 | 540 | 38 | 11693 | 9746 | 22610 | 18241 | 90 | 810 | 55 | 4770228 | 3805194 | 9237122 | 7228454 |
| 60 | 600 | 40 | 9612 | 7931 | 19319 | 15958 | 90 | 900 | 57 | 2115790 | 1721063 | 3980250 | 3176283 |

Table 1. Random graph instances used in our experiments: columns FI1 and FI show the number of feasible inbound sets for $k=\mathrm{tw}(G)-1$ and $k=\mathrm{tw}(G)$, respectively; an empty field means unsuccessful computation within reasonable amount of resource

## Some DIMACS graph coloring instances

| name | $\|V\|$ | $\|E\|$ | tw | $\left\|\Delta_{t w-1}\right\|$ | FIs for $k=t w-1$ | $\left\|\Delta_{t w}\right\|$ | FIs for $k=t w$ |
| :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| myciel6 | 95 | 755 | 35 | 2639 | 2583 | 3938 | 3848 |
| myciel7 | 191 | 2360 | 66 | 223317 | 219381 | 316296 | 309735 |
| queen10_10 | 100 | 1470 | 72 | 2442357 | 1523527 | 4199412 | 2633702 |
| queen11_11 | 121 | 1980 | 87 | 22351589 | 13793133 | 36424473 | 22429873 |
| DSJC125.1 | 125 | 736 | $[48,65]$ | - | - | $\geq^{\dagger} 23302449$ | - |
| DSJC125.5 | 125 | 3891 | 108 | 190816 | 158478 | 347012 | 280655 |
| DSJC250.1 | 250 | 3218 | $[83,177]$ | - | - | $\geq^{\dagger} 1248182$ | - |
| DSJC250.5 | 250 | 15668 | $[221,230]$ | - | - | $\geq^{\dagger} 1882525$ | - |

Table 2. A few hard instances from DIMACS graph coloring benchmark set: FI stands for feasible inbounds; ${ }^{\dagger}$ these lower bounds are $\left|\Delta_{48}(G)\right|,\left|\Delta_{83}(G)\right|$, and $\left|\Delta_{221}(G)\right|$, for each $G$

## Computing environment

CPU: Intel Core i7-6700 (4 cores), 3.40GHz, 8192KB cache RAM:32GB
Operating system: Ubuntu 18.04.1 LTS
Programming language: Java 1.8
JVM: jre1.8.0_111
The maximum heap size: 28 GB

Implementations are single threaded, except that multiple threads may be invoked for garbage collection by JVM.
The time measured is the elapsed time.
To minimize the influence of system processes, the computer is detached from the network and the graphic user interface is disabled.

## Performances of min sep listing algorithms

| \|V | $\|E\|$ | tw - 1 | $\left\|\Delta_{\text {tw-1 }}\right\|$ | time (secs) for generating $\Delta_{\text {tw-1 }}$ |  |  |  | \|heuristic list (no. of missings) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | Basic | Pruning | Pruning+Nibbling | Heuristic |  |
| 70 | 210 | 21 | 299681 |  | 876 | 34 | 17.4 | 299681(0) |
| 70 | 280 | 27 | 498944 | - | 1262 | 102 | 33.5 | 498944(0) |
| 70 | 350 | 32 | 590136 |  | 1348 | 117 | 42.6 | 590136(0) |
| 70 | 420 | 36 | 472728 | - | 970 | 134 | 27.2 | 472728(0) |
| 70 | 490 | 37 | 106296 | 932 | 212 | 33 | 3.84 | 106296(0) |
| 70 | 560 | 41 | 150427 | 766 | 234 | 47 | 5.41 | 150427(0) |
| 70 | 630 | 44 | 150442 | 551 | 221 | 42 | 5.39 | 150442(0) |
| 70 | 700 | 46 | 101673 | 280 | 128 | 30 | 3.45 | 101673(0) |
| 80 | 240 | 24 | 1621664 |  |  | 259 | 68.5 | 1621664(0) |
| 80 | 320 | 30 | 2284149 | - | - | 409 | 99.8 | 2284149(0) |
| 80 | 400 | 34 | 988166 |  | - | 231 | 42.0 | 988166(0) |
| 80 | 480 | 38 | 751344 |  | 2498 | 239 | 31.2 | 751344(0) |
| 80 | 560 | 41 | 458205 | - | 1372 | 163 | 18.7 | 458205(0) |
| 80 | 640 | 45 | 608006 |  | 1453 | 201 | 25.5 | 608006(0) |
| 80 | 720 | 48 | 471433 | - | 1106 | 186 | 19.5 | 471433(0) |
| 80 | 800 | 51 | 438636 |  | 843 | 166 | 18.0 | 438636(0) |

Table 3. Performances of our minimal separator listing algorithms with 1-hour timeout

## Performances of the treewidth algorithms on random instances (1)

| $\|V\|$ | $\|E\|$ | tw | PID |  |  | Ascend |  |  | DESCEND |  |  | Alternate |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  | UB | LB | time(secs) | UB | LB | time(secs) | UB | LB | time(secs) | UB | LB | time(secs) |
| 40 | 120 | 14 | 14 | 14 | 0.530 | 14 | 14 | 0.505 | 14 | 14 | 0.325 | 14 | 14 | 0.335 |
| 40 | 160 | 18 | 18 | 18 | 0.558 | 18 | 18 | 0.992 | 18 | 18 | 0.483 | 18 | 18 | 0.621 |
| 40 | 200 | 20 | 20 | 20 | 0.287 | 20 | 20 | 0.664 | 20 | 20 | 0.308 | 20 | 20 | 0.617 |
| 40 | 240 | 22 | 22 | 22 | 0.203 | 22 | 22 | 0.536 | 22 | 22 | 0.232 | 22 | 22 | 0.379 |
| 40 | 280 | 24 | 24 | 24 | 0.122 | 24 | 24 | 0.429 | 24 | 24 | 0.221 | 24 | 24 | 0.300 |
| 40 | 320 | 25 | 25 | 25 | 0.068 | 25 | 25 | 0.330 | 25 | 25 | 0.155 | 25 | 25 | 0.279 |
| 40 | 360 | 27 | 27 | 27 | 0.058 | 27 | 27 | 0.297 | 27 | 27 | 0.166 | 27 | 27 | 0.267 |
| 40 | 400 | 28 | 28 | 28 | 0.049 | 28 | 28 | 0.276 | 28 | 28 | 0.125 | 28 | 28 | 0.244 |
| 50 | 150 | 16 | 16 | 16 | 9.24 | 16 | 16 | 1.97 | 16 | 16 | 1.67 | 16 | 16 | 2.34 |
| 50 | 200 | 20 | 20 | 20 | 6.09 | 20 | 20 | 2.52 | 20 | 20 | 1.48 | 20 | 20 | 3.46 |
| 50 | 250 | 24 | 24 | 24 | 6.28 | 24 | 24 | 3.54 | 24 | 24 | 1.71 | 24 | 24 | 2.15 |
| 50 | 300 | 26 | 26 | 26 | 1.26 | 26 | 26 | 2.51 | 26 | 26 | 1.04 | 26 | 26 | 2.12 |
| 50 | 350 | 29 | 29 | 29 | 0.974 | 29 | 29 | 2.95 | 29 | 29 | 1.38 | 29 | 29 | 2.04 |
| 50 | 400 | 31 | 31 | 31 | 0.590 | 31 | 31 | 2.27 | 31 | 31 | 0.949 | 31 | 31 | 1.34 |
| 50 | 450 | 32 | 32 | 32 | 0.224 | 32 | 32 | 1.51 | 32 | 32 | 0.528 | 32 | 32 | 1.09 |
| 50 | 500 | 34 | 34 | 34 | 0.198 | 34 | 34 | 1.23 | 34 | 34 | 0.615 | 34 | 34 | 1.06 |
| 60 | 180 | 18 | 18 | 18 | 190 | 18 | 18 | 5.90 | 18 | 18 | 4.08 | 18 | 18 | 4.10 |
| 60 | 240 | 22 | 22 | 22 | 168 | 22 | 22 | 7.61 | 22 | 22 | 5.19 | 22 | 22 | 5.75 |
| 60 | 300 | 27 | 27 | 27 | 263 | 27 | 27 | 18.2 | 27 | 27 | 10.5 | 27 | 27 | 16.8 |
| 60 | 360 | 30 | 30 | 30 | 124 | 30 | 30 | 15.0 | 30 | 30 | 8.26 | 30 | 30 | 14.6 |
| 60 | 420 | 33 | 33 | 33 | 75.7 | 33 | 33 | 15.2 | 33 | 33 | 7.70 | 33 | 33 | 10.8 |
| 60 | 480 | 34 | 34 | 34 | 2.96 | 34 | 34 | 7.47 | 34 | 34 | 3.32 | 34 | 34 | 6.87 |
| 60 | 540 | 38 | 38 | 38 | 7.19 | 38 | 38 | 10.9 | 38 | 38 | 5.44 | 38 | 38 | 10.5 |
| 60 | 600 | 40 | 40 | 40 | 3.85 | 40 | 40 | 8.84 | 40 | 40 | 4.19 | 40 | 40 | 5.89 |

## Performances of the treewidth algorithms on random instances

|  |  |  | PID |  | Ascend |  |  | Descend |  |  | Alternate |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $V$ | \| | $\|E\|$ | tw | UB LB | time(secs) | UB | LB | time(secs) | UB | LB | time(secs) | UB |  | time(secs) |
| 70 | 0210 | 22 | 22 | 17808 | 22 | 22 | 255 | 22 | 22 | 129 | 22 | 22 | 16 |
| 70 | 0280 | 28 | 28 | 16959 | 28 | 28 | 749 | 28 | 28 | 802 | 28 | 28 | 122 |
| 70 | 0350 | 33 | 33 | 16839 | 33 | 33 | 806 | 33 | 33 | 342 | 33 | 33 | 43 |
| 0 | 0420 | 37 | 37 | 8173 | 37 | 37 | 733 | 37 | 37 | 656 | 37 | 37 | 87 |
| 70 | 0490 | 38 | 3838 | 2278 | 38 | 38 | 151 | 38 | 38 | 66.0 | 38 | 38 | 20 |
| 70 | 0560 | 42 | 4242 | 3211 | 42 | 42 | 214 | 42 | 42 | 151 | 42 | 42 | 22 |
| 70 | 0630 | 45 | 4545 | 3052 | 45 | 45 | 185 | 45 | 45 | 137 | 45 | 45 | 122 |
| 70 | 0700 | 47 | 4747 | 1178 | 47 | 47 | 131 | 47 | 47 | 56.5 | 47 | 47 | 116 |
| 80 | 0240 | 25 | 21 | 4812 | 25 | 25 | 3283 | 25 | 25 | 1396 | 25 | 25 | 1548 |
| 80 | 00320 | 31 | 27 | 7095 | 31 | 31 | 6516 | 31 | 31 | 3167 | 31 | 31 | 3632 |
| 80 | 0400 | 35 | 33 | 15647 | 35 | 35 | 1573 | 35 | 35 | 682 | 35 | 35 | 178 |
| 80 | 80480 | 39 | 38 | 15458 | 39 | 39 | 1377 | 39 | 39 | 691 | 39 | 39 | 1578 |
| 80 | 0560 | 42 | 42 | 16767 | 42 | 42 | 813 | 42 | 42 | 339 | 42 | 42 | 65 |
| 80 | 80640 | 46 | 46 | 19764 | 46 | 46 | 1150 | 46 | 46 | 734 | 46 | 46 | 1339 |
| 80 | $0{ }^{2} 720$ | 49 | 4949 | 20958 | 49 | 49 | 934 | 49 | 49 | 362 | 49 | 49 | 109 |
| 80 | 0800 | 52 | $52 \quad 52$ | 17740 | 52 | 52 | 842 | 52 | 52 | 296 | 52 | 52 | 55 |
| 90 | 0270 | 27 | 21 | 6210 |  | 26 | 8755 | 27 |  | 1357 | 30 | 26 | 1652 |
| 90 | 0360 | 35 | 27 | 12283 |  | 32 | 6785 | 35 |  | 109 | 35 | 32 | 10972 |
| 90 | 0450 | 40 | 33 | 19743 |  | 37 | 7398 | 40 | - | 252 | 40 | 37 | 9870 |
| 90 | $0 \mid 540$ | 46 | 38 | 14458 |  | 42 | 7300 | 46 |  | 14896 | 47 | 42 | 1045 |
| 90 | 0630 | 49 | 43 | 17118 |  | 47 | 10983 | 50 | - | 17.9 | 50 | 47 | 1289 |
| 0 | 0720 | 52 | 47 | 16713 |  | 51 | 10294 | 52 |  | 128 | 53 | 51 | 1248 |
| 90 | 0810 | 55 | 51 | 18279 |  | 55 | 15370 | 55 | 55 | 15284 | 55 | 55 | 19642 |
| 90 | 00900 | 57 | 54 | 11509 | 57 | 57 | 8684 | 57 | 57 | 11450 | 57 | 57 | 386 |

6-hour time-out time (seconds) is that of the last improvement

## Performances of the treewidth algorithms on DIMACS instances

| name | $\|V\|$ | $\|E\|$ | tw | PID |  |  | AsCEND |  |  | DESCEND |  |  | Alternate |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | UB | LB | time | UB | LB | time | UB | LB | time | UB | LB | time |
| myciel6 | 95 | 755 | 35 | 35 | 35 | 617 | 35 | 35 | 3.90 | 35 | 35 | 1.89 | 35 | 35 | 3.09 |
| myciel7 | 191 | 2360 | 66 |  | 39 | 10583 | 66 | 66 | 779 | 66 | 66 | 652 | 66 | 66 | 584 |
| queen10_10 | 100 | 1470 | 72 | - | 70 | 10792 | 72 |  | 12363 | 72 | 72 | 3267 | 72 | 72 | 8224 |
| queen11_11 | 121 | 1980 | 87 |  | 79 | 14199 |  | 81 | 19525 | 87 |  | 9114 | 88 | 81 | 20216 |
| DSJC125.1 | 125 | 736 |  |  | 38 | 16140 |  | 45 | 15259 | 65 |  | 0.025 | 65 | 37 | 12758 |
| DSJC125.5 | 125 | 3891 | 108 | 108 | 108 | 1275 | 108 | 108 | 581 | 108 | 108 | 176 | 108 | 108 | 590 |
| DSJC250.1 | 250 | 3218 |  |  | 71 | 15859 |  | 72 | 19840 | 177 |  | 0.235 | 177 | 51 | 10598 |
| DSJC250.5 | 250 | 15668 |  |  | 215 | 20218 |  | 212 | 20732 | 230 |  | 48.8 | 231 | 211 | 19167 |

6-hour time-out
time (seconds) is that of the last improvement

## Minimal separators

$S \subseteq V(G)$ is a separator of $G$ if $G \backslash S:=G[V(G) \backslash S]$ is disconnected
Each connected component of $G \backslash S$ is called a component associated with separator $S$
A component $C$ associated with $S$ is a full component if $N(C)=S$
$S$ is a minimal separator
if it has at least two full components associated with it
or, equivalently, if $S$ separates a pair of vertices but no proper subset of $S$ does not separator this pair.
full components

components associated with $S$

## Feasibility of a connected set: subproblem for DP

Fix $G$ and $k$.
A connected $C \subseteq V(G)$ is feasible with respect to $\Delta \subseteq \Delta_{k}(G)$ if
there is a tree-decomposition of $G[N[C]]$ of width $\leq k$ that

- has a bag containing $N(C)$ and
- uses separators only from $\Delta$



## Dynamic programming for treewidth

Dynamic programming of Bouchitte and Todinca 2001:

1. List minimal separators and potential maximal cliques
2. Decide the feasibility of components associated with minimal separators, through a recurrence involving potential maximal cliques
Positive instance driven (PID) variant (Tamaki 2017)
Does not list minimal separators or potential maximal cliques in advance
Generates "on the fly"

- feasible components associated with minimal separators
- potential maximal cliques needed to show their feasibility

New approach

1. List minimal separators, but not potential maximal cliques
2. Decide the feasibility of components associated with minimal separators through a direct recurrence, in which potential maximal cliques are implicit

## Well-formed tree-decompositions (1)

$U \subseteq V(G)$ is baggy if

- there is no connected set $C$ such that $N(C)=U$ and
- for every non-empty $X \subseteq U$,
- there is a connected set $C$ containing $X$ such that $N(C)=U \backslash X$.
Note:


A potential maximal clique is baggy, but not vice versa

## Well-formed tree-decompositions (1)

$U \subseteq V(G)$ is baggy if

- there is no connected set $C$ such that $N(C)=U$ and
- for every non-empty $X \subseteq U$,
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Note:
A potential maximal clique is baggy, but not vice versa



## Well-formed tree-decompositions (2)

Tree-decomposition $T$ of $G$ is well-formed if

- every bag of T is baggy and,
- for every connected vertex set $C$ of $G$ such that $C$ is a component of $G \backslash X$ for some bag $X$ of $T$,
- there is a subtree $T^{\prime}$ of $T$ and a bag $Y$ in $T^{\prime}$ such that
- $T^{\prime}$ is a tree-decomposition of $G[N[C]]$,
- $Y$ is adjacent to a bag of $T$, say $Z$, not in $T^{\prime}$ with $Y \cap Z=N(C)$.
Proposition
Every graph $G$ has a well-formed tree-decomposition of
 width $\operatorname{tw}(G)$.


## Reason:

The tree-decomposition corresponding to a minimal triangulation of $G$ is well-formed

## Well-feasibility of connected sets

A connected $C \subseteq V(G)$ is well-feasible with respect to $\Delta \subseteq \Delta_{k}(G)$ if
there is a well-formed tree-decomposition of $G[N[C]]$ that

- has a bag containing $N(C)$ and
- uses separators only from $\Delta$

Note:
For $\Delta=\Delta_{k}(G), C$ is well-feasible if and only if $C$ is feasible.

## Orienting minimal separators

Assume a total order on the vertices:
$V(G)=\{1,2, \ldots, n\}$
Induced partial order on vertex sets:
$U<V$ if $\min U<\min V$
A connected set $C$ is inbound if
there is a full component $D$ associated with $N(C)$ such that $D<C$
otherwise $C$ is outbound


## Dynamic programming algorithm (1)

Main iteration of msDP: decides the feasibility of each inbound connected set with respect to $\Delta \subseteq \Delta_{k}(G)$

1: Let $L$ be the list of all inbound connected sets $C$ with $N(C) \in \Delta$
2: Sort $L$ in the increasing order of cardinality
3: for all $C$ in $L$ do
4: if isFeasible $(C)$ then mark $C$ as feasible
5: end for

## isFeasible(C)



## isFeasible(C)



## isFeasible(C)



## isFeasible(C)



## isFeasible(C)

## Case 1: $S$ does not have a full component

A right bag $X=S$ is found, if all these inbounds are feasible


## isFeasible(C)

## Case 2: $S$ has a full component $D$



## isFeasible(C)

## Case 2: $S$ has a full component $D$

If any of the inbounds are not marked feasible, then fail Otherwise, call isFeasible ( $D$ )


## Dynamic programming algorithm (2)

```
procedure isFeasible \((C)\)
    if \(N(C) \in \Delta\) and \(|N[C]| \leq k+1\) then return true
    for all inbound \(D\) with \(\min (C) \in D\) marked feasible do
        if allFeasible \((N(C) \cup N(D), C)\) then return true
    end for
    return allFeasible \((N(C) \cup\{\min (C)\}, C)\)
    end procedure
    procedure allFeasible \((S, C)\)
    if \(|S|>k+1\) then return false
    for all component \(D\) associated with \(S\) such that \(D \subseteq C\) do
        if \(N(D)=S\) then
            if not isFeasible \((D)\) then return false
        else
            assert \(D\) is inbound
            if \(D\) is not marked as feasible then return false
        end if
        end for
        return true
    end procedure
```


## Theorem: correctness of the algorithm

Let $C \subseteq V(G)$ be connected with $|N(C)| \leq k$.

- If call isFeasible ( $C$ ) is made during the execution of our dynamic programming algorithm, and returns true then $C$ is feasible with respect to $\Delta$.
- if $C$ is inbound with $N(C) \in \Delta$ and moreover is well-feasible with respect to $\Delta$, then the algorithm marks $C$ as feasible.


## Structure of $\Delta(G)$ : the set of all minimal separators of $G$

Let $A \subseteq V(G)$ be connected.
For each component $C$ of $G \backslash A, N(C)$ is a minimal separator, called a minimal separator close to $A$

Digraph $\Lambda(G)$ on $\Delta(G)$ :
has an edge from $S$ to $R$ if and only if $R$
is a separator close to $C \cup\{v\}$ for some full component $C$ of $S$ and $v \in S$.


Theorem [Berry et al. 2000]
Every minimal separator of $G$ is reachable in $\Lambda(G)$ from a separator close to a singleton
$=>$ Algorithm for listing all minimal separators in $O\left(n^{3}\right)$ time per each.


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Digraph $\Lambda(G)$ on $\Delta(G)$ :
has an edge from $S$ to $R$ if and only if $R$
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Theorem [Berry et al. 2000]
Every minimal separator of $G$ is reachable in $\Lambda(G)$ from a separator close to a singleton
$=>$ Algorithm for listing all minimal separators in $O\left(n^{3}\right)$ time per each.


## Generating $\Delta_{k}(G)$

Based on Takata's algorithm for generating $\Delta(G)$

- backtrack search through $\Lambda(G)$
- pick S only if $|S| \leq k$
- exploit the cardinality constraint for pruning

For $A \subseteq V(G)$ connected such that
$N[A]$ is an $a-b$ minimal separator and
$F \subseteq N(A)$

$N(A)$
define
$\Delta_{a b}(A, F)$ : the set of all $a-b$ minimal separators $S$ satisfying ...

## Generating $\Delta_{k}(G)$

For $A \subseteq V(G)$ connected such that
$N[A]$ is an $a-b$ minimal separator and
$F \subseteq N(A)$
define
$\Delta_{a b}(A, F)$ : the set of all $a-b$ minimal separators $S$ satisfying

- $|S| \leq k$
- $F \subseteq S$

- The component $C_{a}$ of $G \backslash S$ containing $a$ contains $A$
- The component $C_{b}$ of $G \backslash S$ containing $b$ is disjoint from $N[A]$
- $a=\min \left(C_{a}\right)$ and $b=\min \left(C_{b}\right)$
- $\left|C_{a}\right| \leq\left|C_{b}\right|$


## Base cases for $\Delta_{a b}(A, F)$

$\Delta_{a b}(A, F)$ is empty if either

- $|S|>F$
- $F \backslash N\left(C_{b}\right) \neq \emptyset$, where $C_{b}$ is the component of $G \backslash N(A)$ containing $b$
- $\min (A) \neq a$ or $\min \left(C_{b}\right) \neq b$
- $|F|=k$ and $N(A) \neq F$
- $|A|>\left|C_{b}\right|$
- $|N(A)|>k$ and

$N(A)$

$$
|A|+(|N(A)|-k)>\min \left\{\left|C_{b}\right|, \frac{(|V(G)|-k)}{2}\right\}
$$

$$
\begin{aligned}
& \Delta_{a b}(A, F)=\{F\} \text { if } \\
& \quad N(A)=N\left(C_{b}\right)=F,|F| \leq k, \text { and }|A| \leq\left|C_{b}\right|
\end{aligned}
$$

## Recurrence for $\Delta_{a b}(A, F)$

$\left.\Delta_{a b}(A, F)=\Delta_{a b}(A, F \cup\{v\})\right) \cup \Delta_{a b}\left(A^{\prime}, F\right)$
where $\boldsymbol{v} \in N(A) \backslash F$ is arbitrary and $N\left(A^{\prime}\right)$ is the minimal $(A \cup\{v\})$ $b$ separator close to $A \cup\{\mathcal{V}\}$.


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## Pruning



## Pruning



Vertex disjoint paths from $N(A) \backslash F$ through $V(G) \backslash N[A]$

## Pruning

$$
k=3
$$



Vertex disjoint paths from $N(A) \backslash F$ through $V(G) \backslash N[A]$

This many (15) vertices must be added to the $a$-side of any minimal separator in $\Delta_{a b}(A, F)$
$\Delta_{a b}(A, F)$ is empty if $|A|+15$ is too large for a smaller of the two full components of a minimal separator

## How to iterate through $(a, b)$ pairs?

Observation:
$X$ : an arbitrary separator of $G$
A minimal separator $S$ of $G$ either
crosses X
or
is loca/ to some component $C$ of $G \backslash X$


## Divide and conquer?

$\Delta_{k}(G)$ is the union of

- $\Delta_{a b}$ for each pair $a, b \in X$
- $\Delta_{k}(H)$ for local graph $H$ that arises from each component of $G \backslash X$

Should $X$ be a balanced separator?

## Divide and conquer?

$\Delta_{k}(G)$ is the union of

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Should $X$ be a balanced separator?
NO (experimental observation)
Having small $|X|$ or small number of non-adjacent $(a, b)$ pairs in $X$ is much more important!
Choose $X$ to be $N(v)$ with the smallest number of nonadjacent pairs: $v$ is a minfill vertex
Nibling

## Heuristic listing

- Used to improve an upper bound of treewidth
- Can assume we have a tree-decomposition $T$ of width $\geq$ $k+1$
- The initial set $\Delta^{0}$ consists of minimal separators each of which is local to some bag of $T$
- The expansion $\Delta^{\{i+1\}}$ of $\Delta^{i}$ is obtained by adding the successors of $S$ in $\Lambda(G)$ that are in $\Delta_{k}(G)$, for each $S \in \Delta^{i}$


## Thank you!

