

**Phase transitions in combinatorial optimization problems**  
**Course at Helsinki Technical University, Finland, autumn 2007**  
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**Lecture 3, 25. September 2007**

Better situation for:

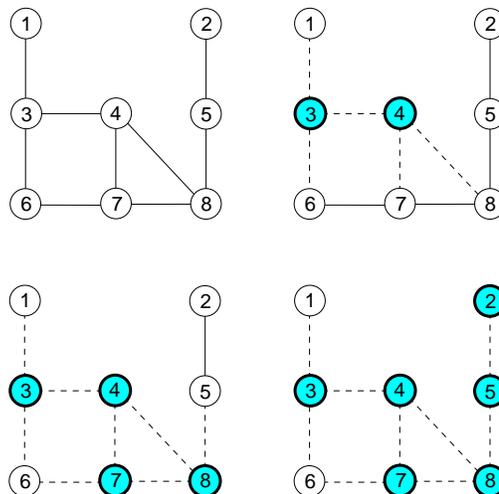
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algorithm 2-approximation( $G = (V, E)$ )
begin
  initialize  $V_{vc} = \emptyset$ ;
  initialize  $M = \emptyset$ ;
  while there are uncovered edges (i. e.,  $E \neq \emptyset$ ) do
    begin
      take one arbitrary edge  $\{i, j\} \in E$ ;
      mark  $i$  and  $j$  as covered:  $V_{vc} = V_{vc} \cup \{i, j\}$ ;
      add  $\{i, j\}$  to the matching:  $M = M \cup \{\{i, j\}\}$ ;
      remove from  $E$  all edges incident to  $i$  or  $j$ ;
    end;
  return( $V_{vc}$ );
end

```

Example: 2-Approximation heuristic

- It. 1 (say) edge  $\{3, 4\} \rightarrow V_{vc} = \{3, 4\}$ ,  $M = \{\{3, 4\}\}$   
 $\{1, 3\}$ ,  $\{3, 4\}$ ,  $\{3, 6\}$ ,  $\{4, 7\}$  and  $\{4, 8\}$  are covered
- It. 2  $\{7, 8\} \rightarrow V_{vc} = \{3, 4, 7, 8\}$ ,  $M = \{\{3, 4\}, \{7, 8\}\}$   
 also  $\{5, 8\}$ ,  $\{6, 7\}$  and  $\{7, 8\}$  are covered
- It. 3 Only edge  $\{2, 5\}$  is left  $\rightarrow V_{vc} = \{2, 3, 4, 5, 7, 8\}$ ,  $M = \{\{3, 4\}, \{7, 8\}, \{2, 5\}\}$ .



Note 1: For order  $\{1, 3\}$ ,  $\{2, 5\}$ ,  $\{6, 7\}$  and  $\{4, 8\}$   $V_{vc} = V$  twice the size of minimum VC.

Note 2: never be able to “find” the minimum VC: e.g.,  $V_{vc}^{\min} = \{3, 5, 7, 8\}$ .  $\square$

Theorem: size  $|V_{vc}| \leq 2|V_{vc}^{\min}|$ .

**Proof:**

Algorithm also constructs matching  $M$ . Since two vertices in  $V_{vc}$  for each edge in  $M \rightarrow$

$$|V_{vc}| = 2|M|. \quad (1)$$

Since (by Def. of matching): the edges in  $M$  do not “touch” each other, one has to cover at least one vertex per edge of  $M$ .  $\rightarrow$

$$|V_{vc}^{\min}| \geq |M|. \quad (2)$$

Combining Eqs (1) and (2) we get  $|V_{vc}| = 2|M| \leq 2|V_{vc}^{\min}|$ . QED

### 3.2 Branch-and-bound algorithm

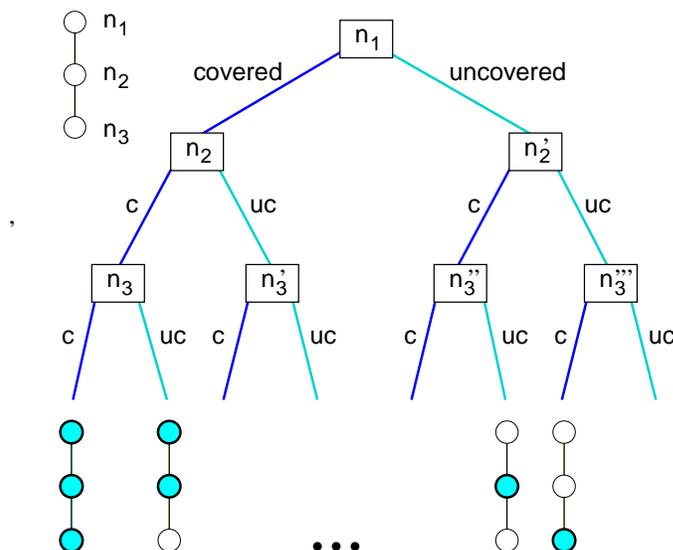
Finds exact minimum VC (optimization problem 2)

(Remark: if in algorithm a vertex  $i$  is (temporarily) covered, we say we put a covering mark on it. Vertices not decided yet (cov/uncov): free)

Basic idea:  $2^N$  possible configurations  $\in \{\text{cov}, \text{uncov}\}^N$

$\rightarrow$  binary configuration tree

$\rightarrow$  algorithms builds tree node by node (via backtracking) and determines smallest VC



$\rightarrow$  For sure exponential running time.

Speedup: omit subtrees if possible:

- No further descent if VC has been found.
- Cover neighbours of uncovered vertices.
- Bound. Store:
  - *best*: size of the smallest VC found so far (initially  $best = N$ ).
  - $X$  number of vertices covered so far
  - current degrees of free vertices  $d_i$ .  
Ordered  $d_{o_1} \geq d_{o_2} \geq \dots d_{o_{N'}}$

Example:

$F = 3$	
$i$	$d_i$
5	7
23	6
12	6
33	6
2	5
$\vdots$	$\vdots$

$F := best - X$  available number of covering marks  
 note: if only ONE best solution is to be obtained,  
 one can use  $F = best - X - 1$

$D := \sum_{l=1}^F d_{o_l}$  best one can achieve with  $F$  marks  
**if**  $D < \#$  current uncovered edges **then** bound!

**algorithm** branch-and-bound( $G$ ,  $best$ ,  $X$ )

**begin**

**if** all edges are covered **then**

**begin**

**if**  $X < best$  **then**  $best := X$

**return**;

**end**;

  calculate  $F = best - X$ ;  $D = \sum_{l=1}^F d_l$ ;

**if**  $D < \text{number of } \underline{\text{uncovered}} \text{ edges}$  **then**

**return**;           **comment** bound;

  take one free vertex  $i$  with the largest current degree  $d_i$ ;

  mark  $i$  as covered; **comment** left subtree

$X := X + 1$ ;

  remove from  $E$  all edges  $\{i, j\}$  incident to  $i$ ;

**branch-and-bound**( $G$ ,  $best$ ,  $X$ );

  reinsert all edges  $\{i, j\}$  which have been removed;

$X := X - 1$ ;

**if** ( $F \geq \text{number of current neighbors}$ ) **then**

**begin**                   **comment** right subtree;

      mark  $i$  as uncovered;

**for** all neighbors  $j$  of  $i$  **do**

**begin**

          mark  $j$  as covered;  $X := X + 1$ ;

          remove from  $E$  all edges  $\{j, k\}$  incident to  $j$ ;

**end**;

**branch-and-bound**( $G$ ,  $best$ ,  $X$ );

**for** all neighbors  $j$  of  $i$  **do**

        mark  $j$  as free;  $X := X - 1$ ;

        reinsert all edges  $\{j, k\}$  which have been removed;

**end**;

  mark  $i$  as free;

**return;**  
**end**

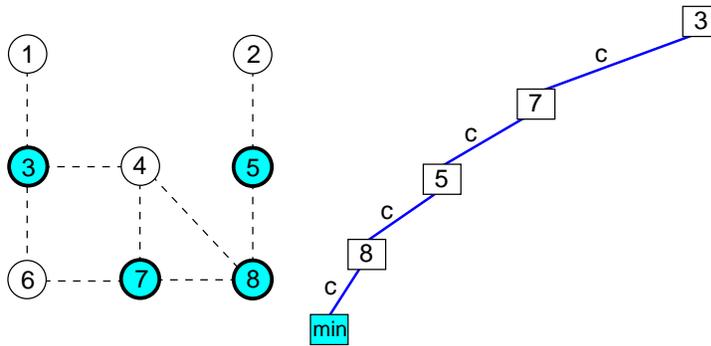
first call: branch-and-bound( $G, best, 0$ ).

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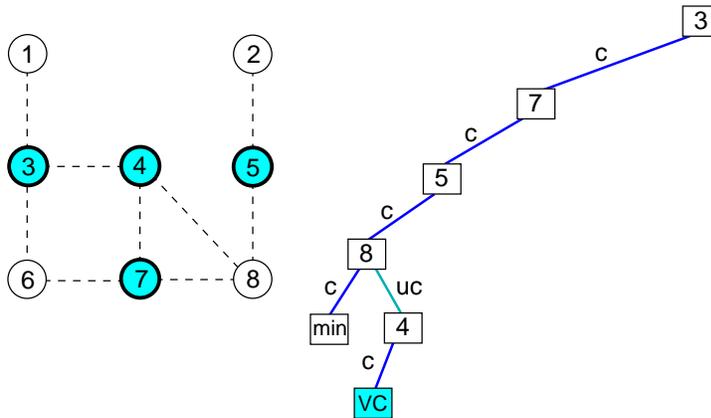
Example: Branch-and-bound algorithm

Graph from Ex. for heuristic.

First descent: exactly as the heuristics.  $\rightarrow$  Fig. ( graph and the corresponding current configuration tree):  $best := 4$ .



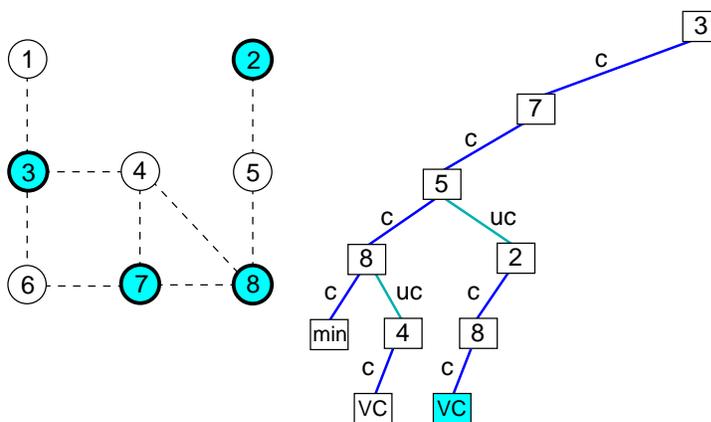
Algorithm  $\rightarrow$  preceding level of the configuration tree. Vertex 8: *uncovered*. All its *uncovered* neighbours: *covered* (vertex 4)  $\rightarrow$



Next (recursive) call: Again full VC, but not smaller  $\rightarrow$  backtracking.

Vertex 8 is *free* again, backtracking

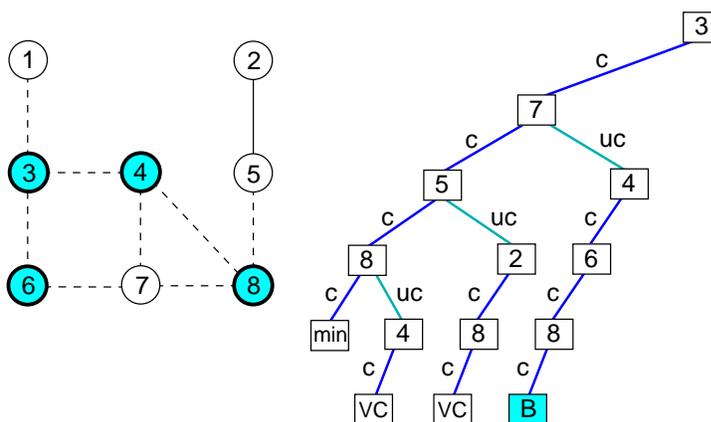
Vertex 5: *uncovered*  $\rightarrow$  its neighbours (2 and 8): *covered*



Next call: Again full VC, but not smaller  $\rightarrow$  backtracking.

Vertex 5 is *free* again, backtracking

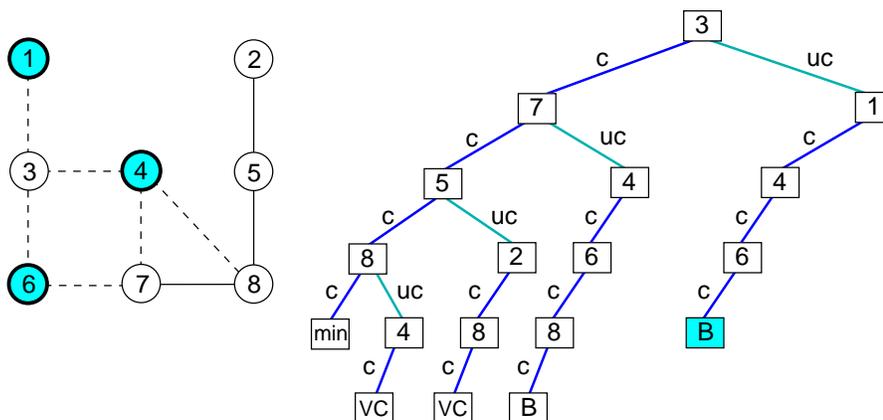
Vertex 7: *uncovered*, its neighbours, (4, 6 and 8): *covered*,



Next call: no cover yet (edge  $\{2, 5\}$  is uncovered)  $\rightarrow$  bound is evaluated:  
 $X = 4 \rightarrow F = best - X = 0 \rightarrow D = 0 < \#$  uncovered edges.  $\rightarrow$  bound!  
 $\rightarrow$ (no subtree) backtracking

Vertex 7 is *free* again, backtracking  $\rightarrow$  top level

Vertex 3: *uncovered*, its neighbours, (1, 4, 6): *covered*,



next call: no cover yet  $\rightarrow$  bound evaluated:  $X = 3 \rightarrow F = best - X = 4 - 3 = 1$ : Vertex 8 has the highest current degree  $d_8 = 2$ , hence  $D = 2 < \#$  of uncovered edges is 3.  $\rightarrow$  bound!  $\rightarrow$ (no subtree) backtracking

$\rightarrow$  algorithm finishes.

Note: configuration tree has 18 nodes, compared to 511 nodes (with  $2^8 = 256$  leaves) of full configuration tree.  $\square$

Implementation : for fast access the  $F$  vertices of largest current degree (sublinear  $N$  treatment)  $\rightarrow$

two arrays  $v_1, v_2$  of sets of vertices indexed by the current degrees.

$v_1$ : top  $F$  free vertices

$v_2$ : other free vertices

also store for each vertex: pointer to current set

insert/remove when *free*  $\leftrightarrow$  *covered,uncovered*

also lowest entry  $v_1 \leftrightarrow$  top entry  $v_2$

Algorithm for optimization problem 1:

$\tilde{X} = |V_{vc}|$  is given.

*best*: smallest number of uncovered edges (i. e., the energy) so far.

$F = \tilde{X} - X$  additional vertices coverable.

Again  $D = \sum_{i=1}^F d_{O_i}$ : sum of highest degrees.

If  $best \leq (\text{current } \# \text{ of uncovered edges}) - D \rightarrow$  bound !

(note: NO automatic covering of neighbors!)

stop if  $best = 0$