

Advanced topics on Algorithms

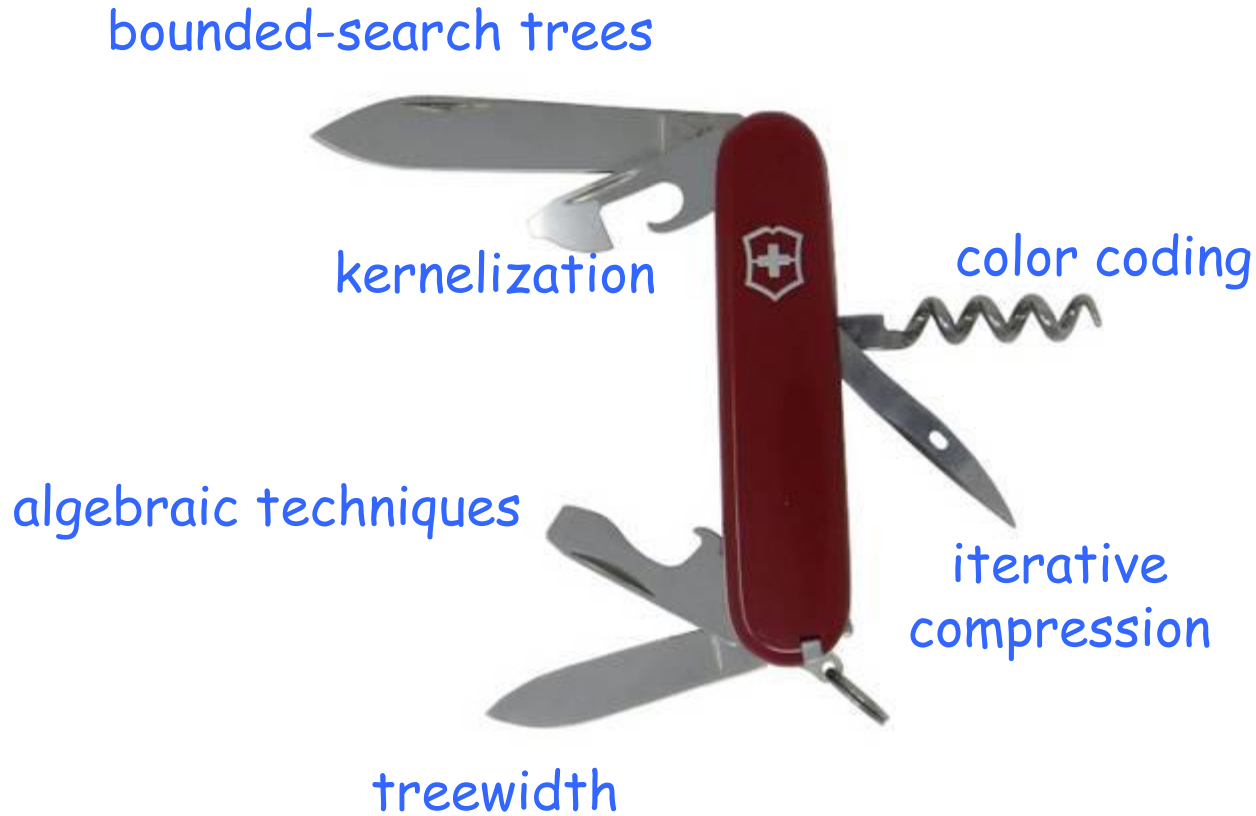
Luciano Gualà

www.mat.uniroma2.it/~guala/

Parameterized algorithms

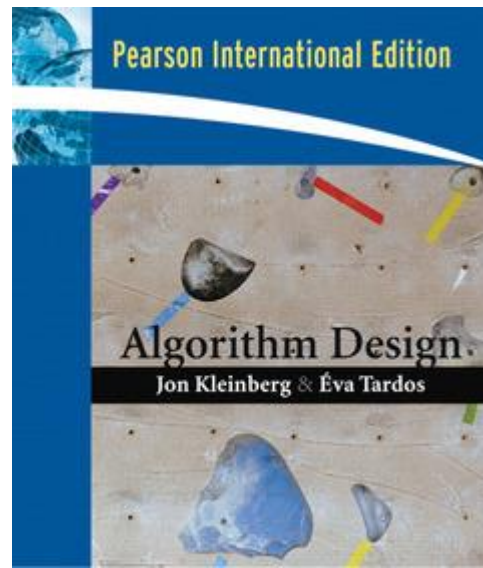
Episode III

Toolbox (to show a problem is FPT)



Treewidth

reference
(Chapter 10.4)



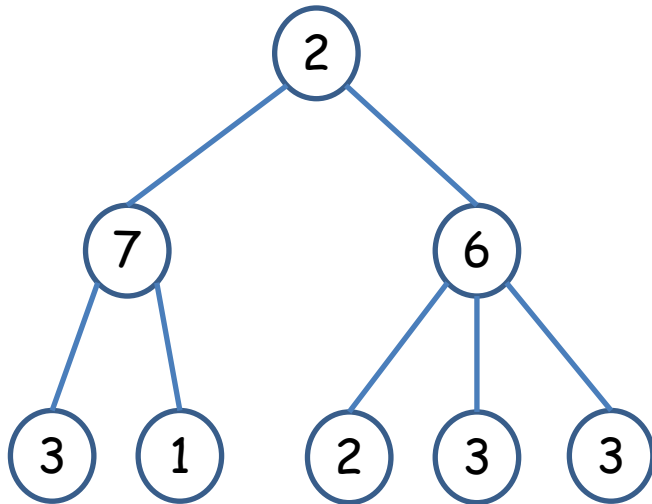
The party problem

problem: invite people to a party

maximize: total fun factor of the invited people

constraint: everyone should be having fun

➔ do not invite a colleague and his direct boss at the same time!



input: a tree with weights on the nodes

goal: an independent set of maximum total weight

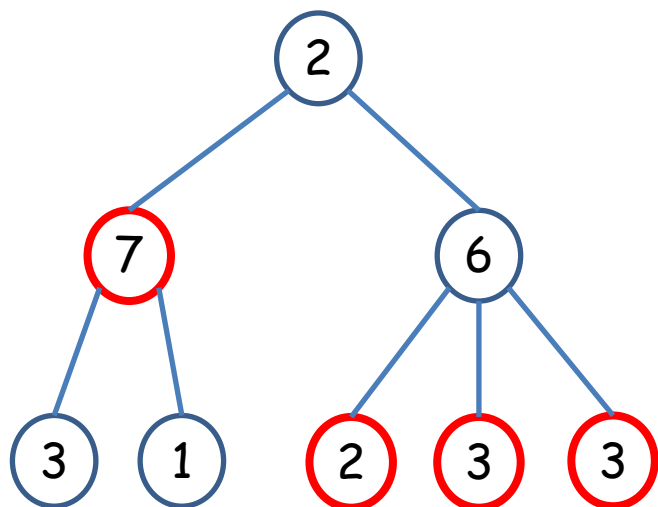
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OPT= 15

weighted independent set on trees: a dynamic programming algorithm

Subproblems:

For each v of T :

- T_v : subtree of T rooted at v
- $A[v]$: weight of a maximum weighted IS of T_v
- $B[v]$: weight of a maximum weighted IS of T_v
that does not contain v

goal: determine $A[r]$ for the root r

v leaf: $A[v]=w_v$ $B[v]=0$

v internal node with children u_1, \dots, u_d :

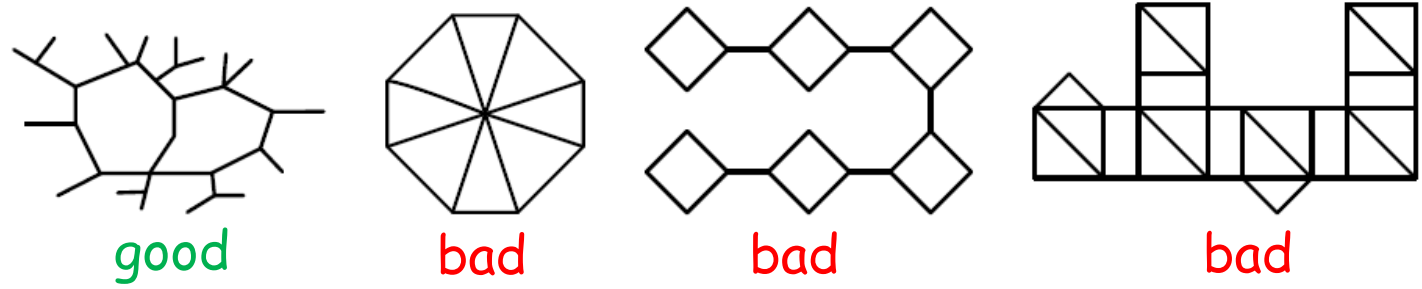
$$B[v] = \sum_{i=1}^d A[u_i]$$

$$A[v] = \max\left\{ B[v], w_v + \sum_{i=1}^d B[u_i] \right\}$$

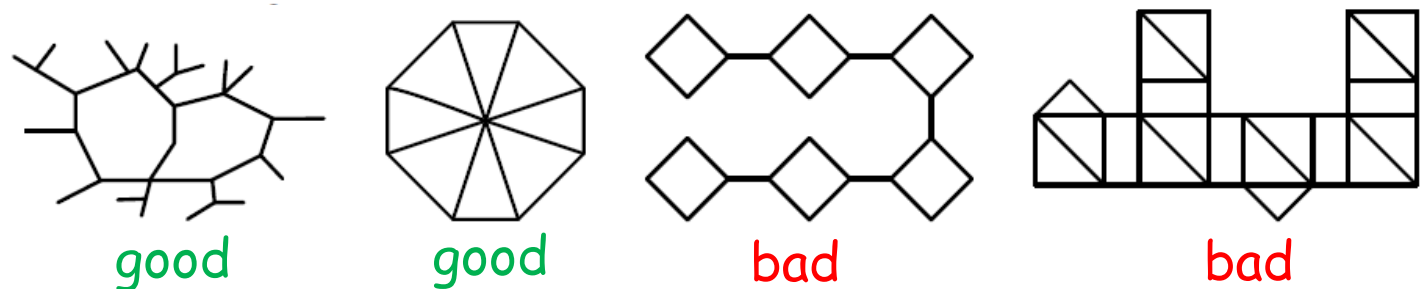
order for the subproblems: bottom up

Generalizing trees: How could we define that a graph is "treelike"?

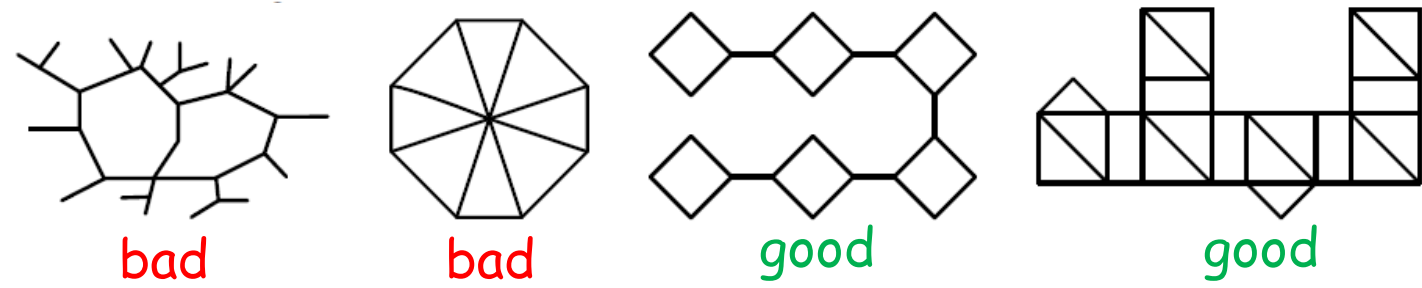
def 1: number of cycles is bounded



def 2: removing a bounded number of vertices makes it acyclic



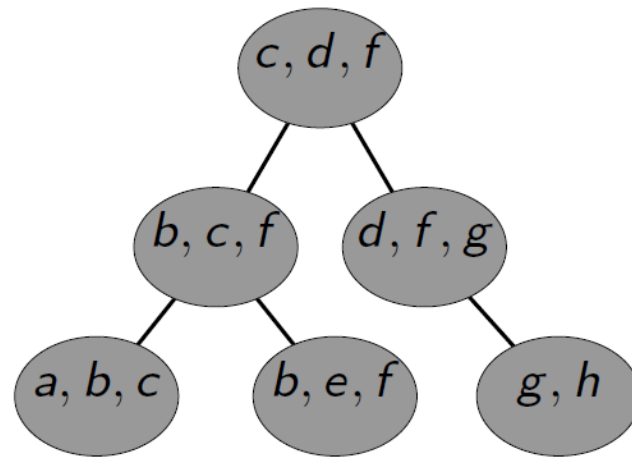
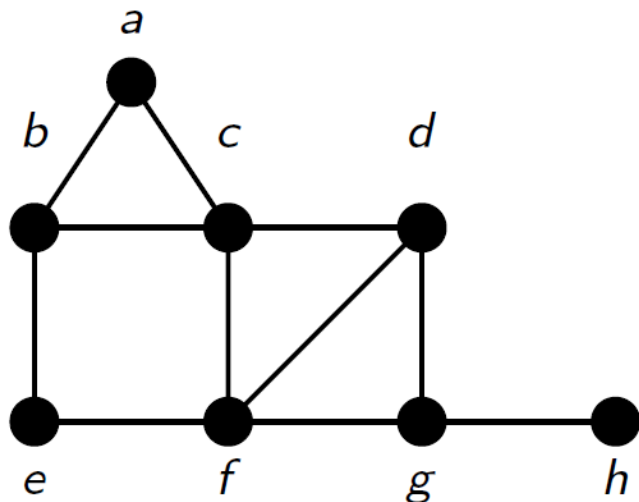
def 3: bounded-size parts connected in a tree-like way

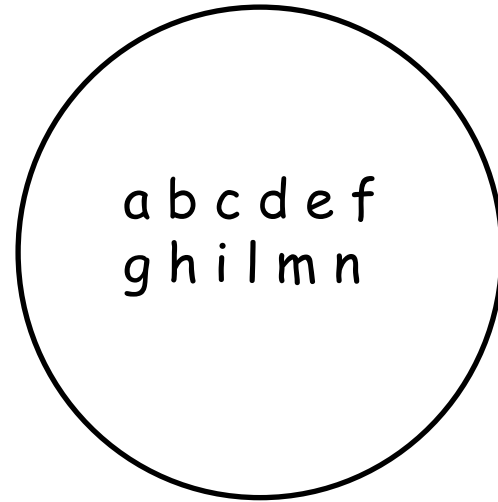
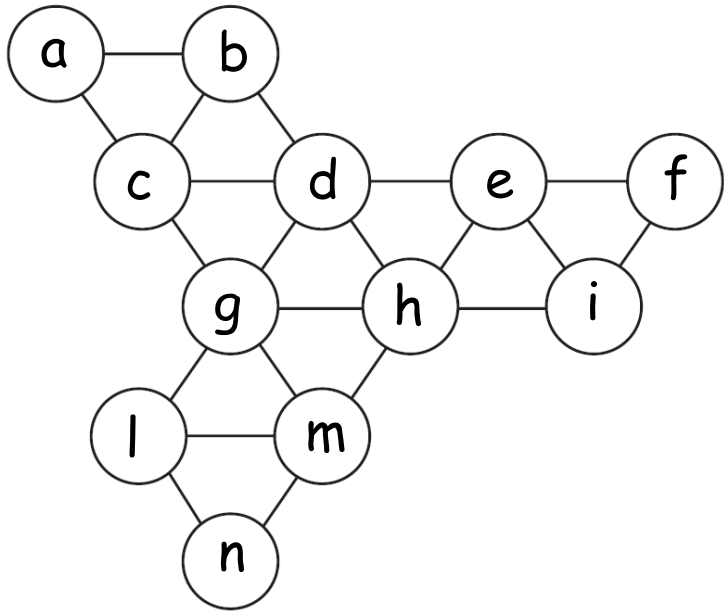


A **tree decomposition** $(T, \{V_t : t \in T\})$ of a graph $G=(V,E)$ consists of a tree T (on a different node set from G), and a **piece** $V_t \subseteq V$ associated with each node t of T that satisfies the following three properties:

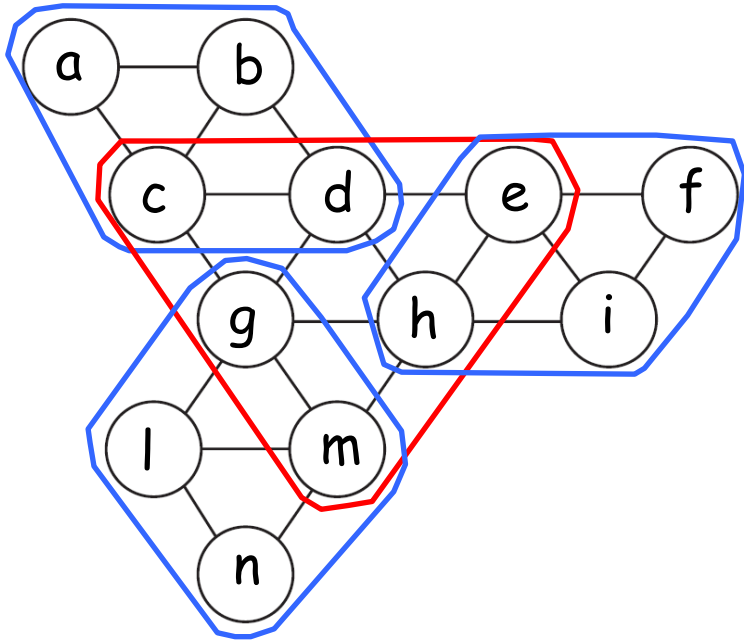
- **(Node Coverage)**: every node of G belongs to at least one piece V_t ;
- **(Edge Coverage)**: for every edge e of G , there is some piece V_t containing both endpoints of e ;
- **(Coherence)**: Let t_1, t_2 and t_3 be three nodes of T such that t_2 lies on the path from t_1 and t_3 . Then, if a node v of G belongs to both V_{t_1} and V_{t_3} it also belongs to V_{t_2}

the **width** of $(T, \{V_t : t \in T\})$: $\max_t |V_t| - 1$

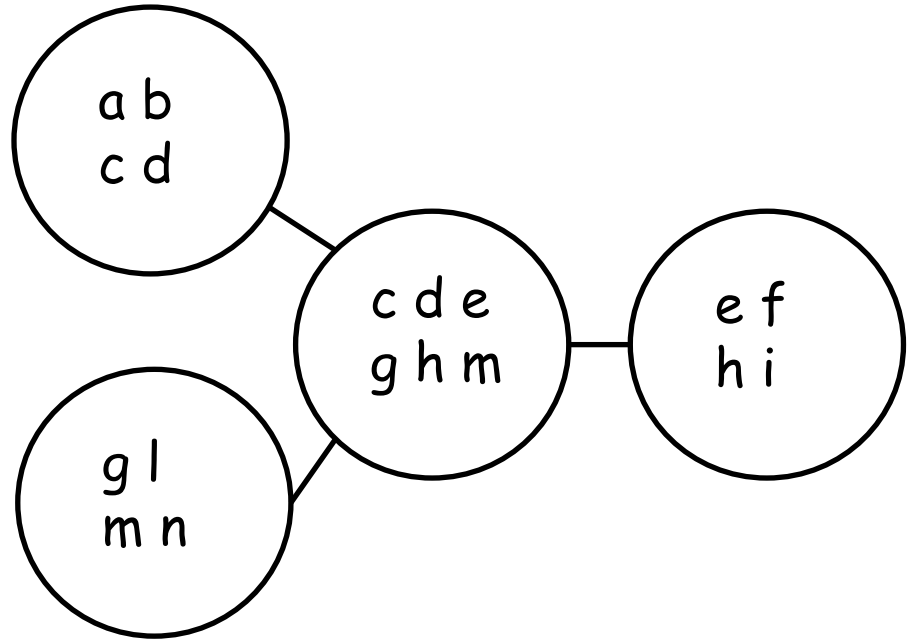


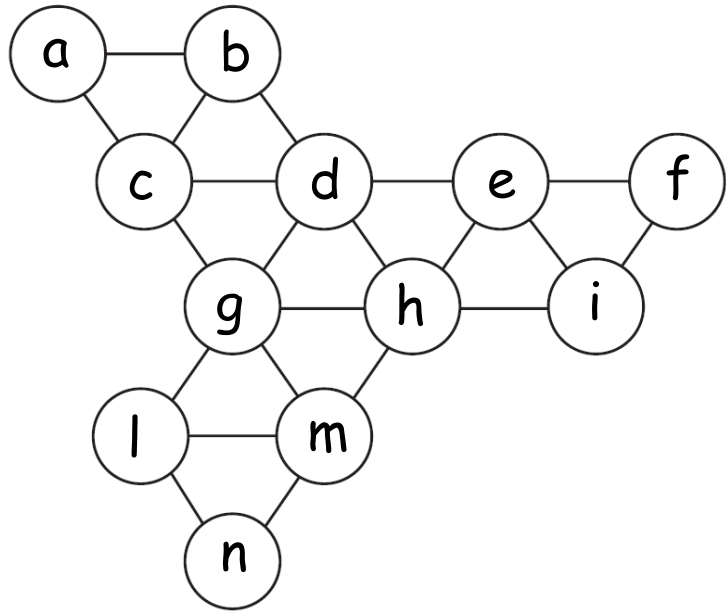


width = 11

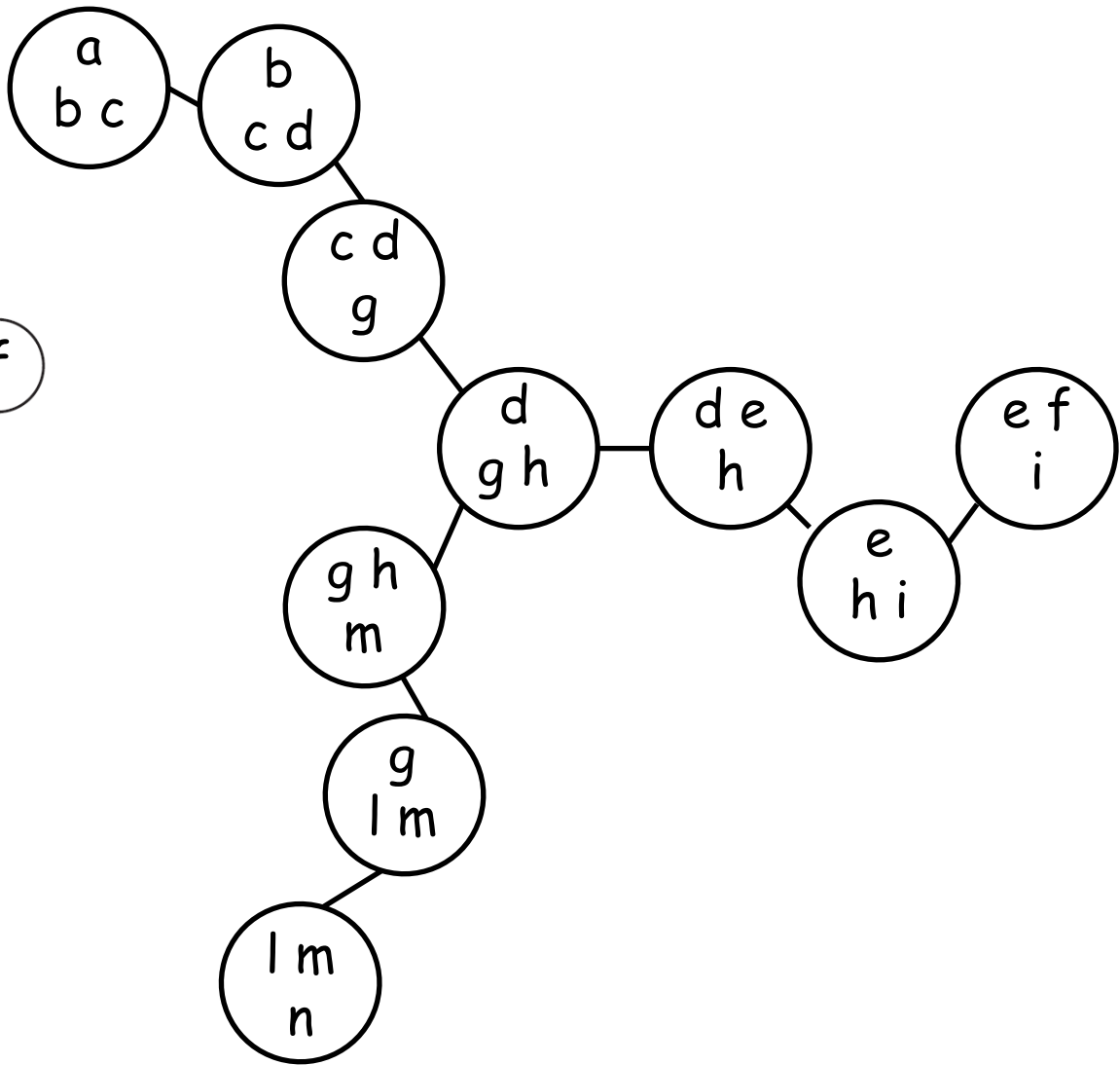


width = 5





width = 2

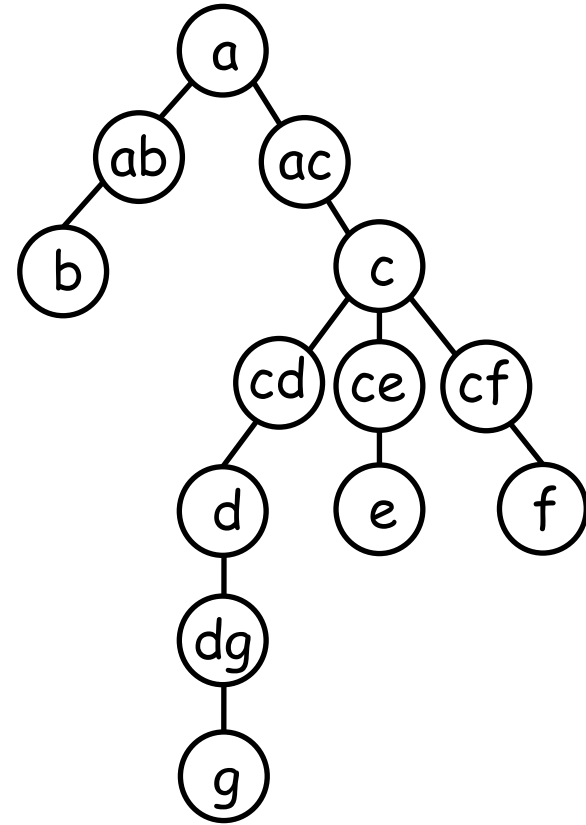
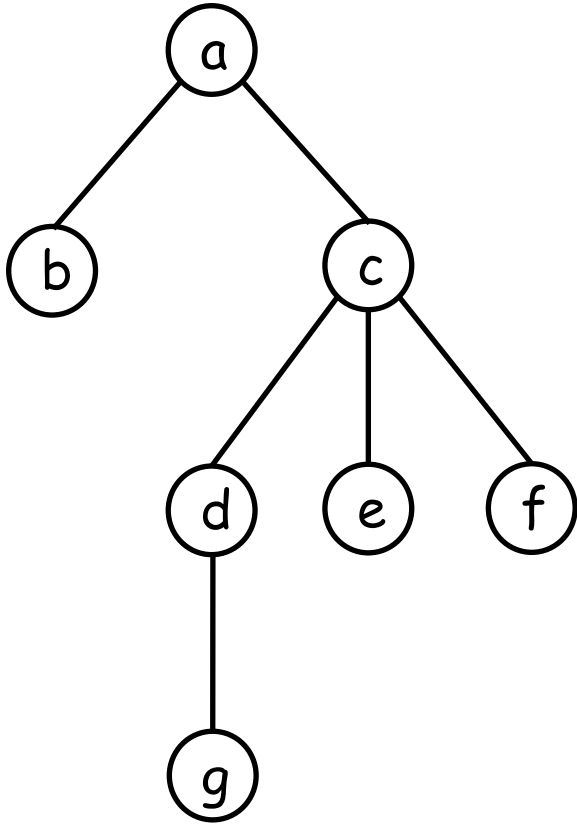


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the **width** of $(T, \{V_t : t \in T\})$: $\max_t |V_t| - 1$

the **treewidth** of G : width of the best tree decomposition of G



the **treewidth** of a tree is 1

Let T' be a subgraph of T .

$G_{T'}$: subgraph of G induced by the nodes in all pieces associated with nodes of T' , that is, the set $\cup_{t \in T'} V_t$.

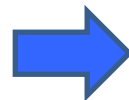
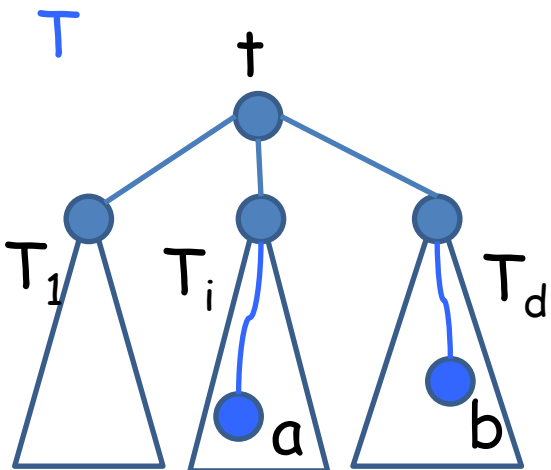
deleting a node t from T

Lemma

Suppose that $T-t$ has components T_1, \dots, T_d . Then the subgraphs

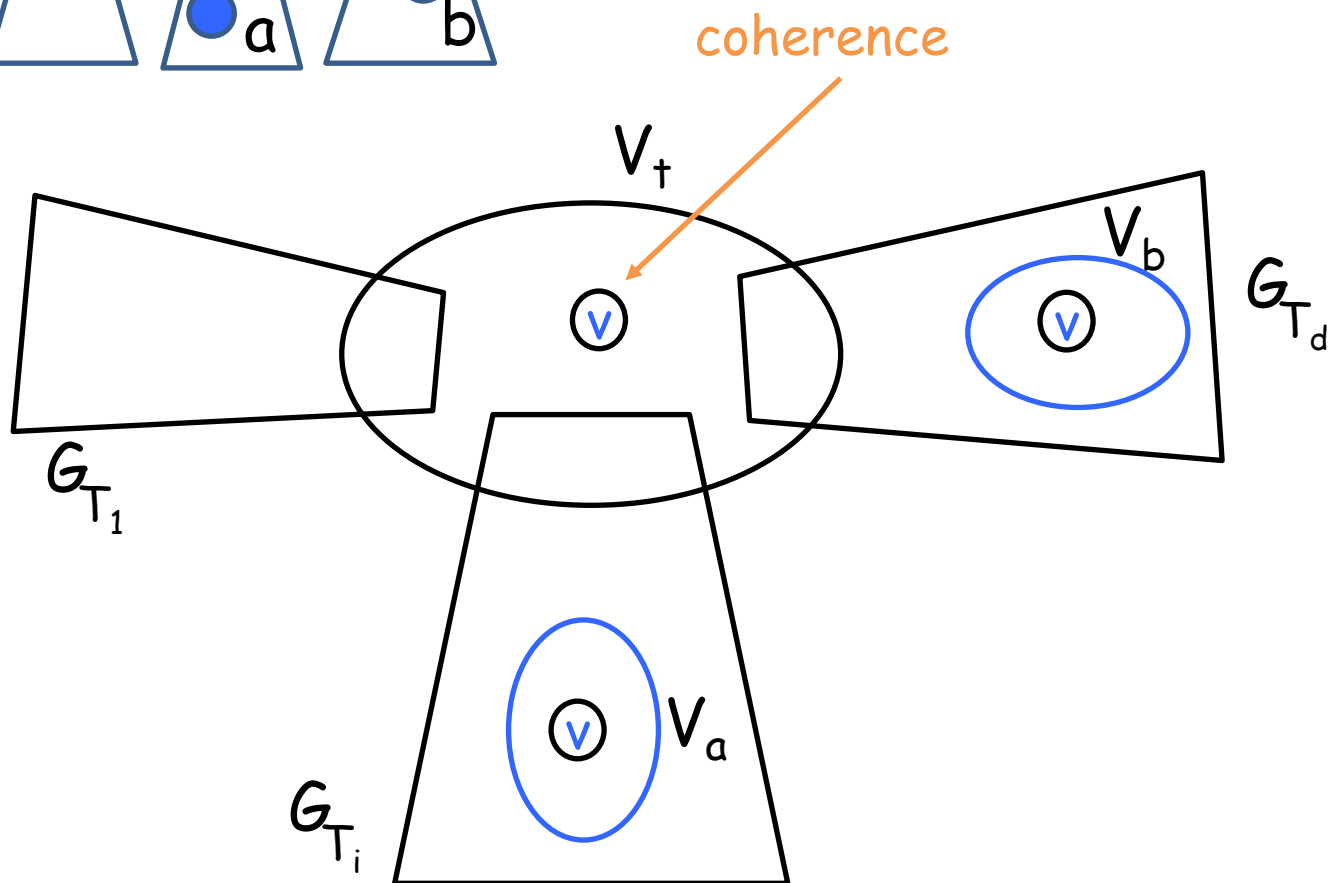
$$G_{T_1 - V_t}, G_{T_2 - V_t}, \dots, G_{T_d - V_t},$$

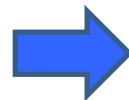
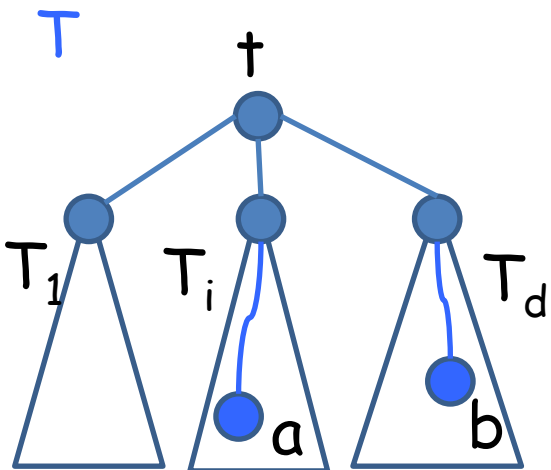
have no nodes in common, and there are no edges between them.



contradiction!

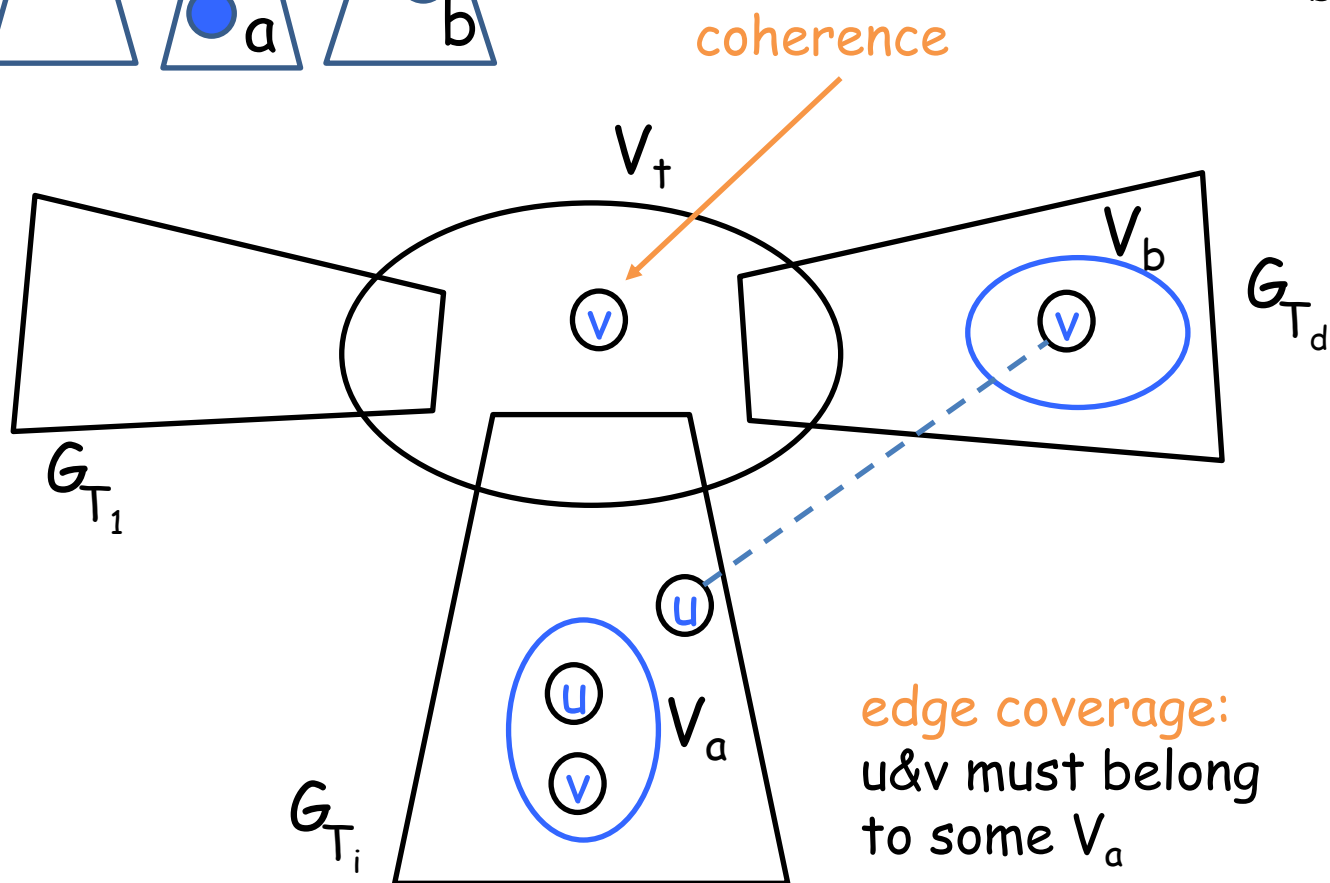
no nodes in
common





contradiction!

no edges
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edge coverage:
u & v must belong
to some V_a

Let T' be a subgraph of T .

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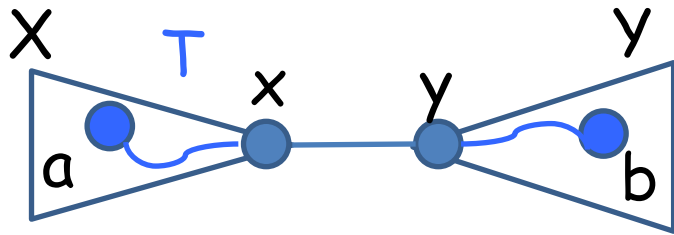
deleting an edge (x,y) from T

Lemma

Let X and Y be the two components of T after the deletion of the edge (x,y) . Then the two subgraphs

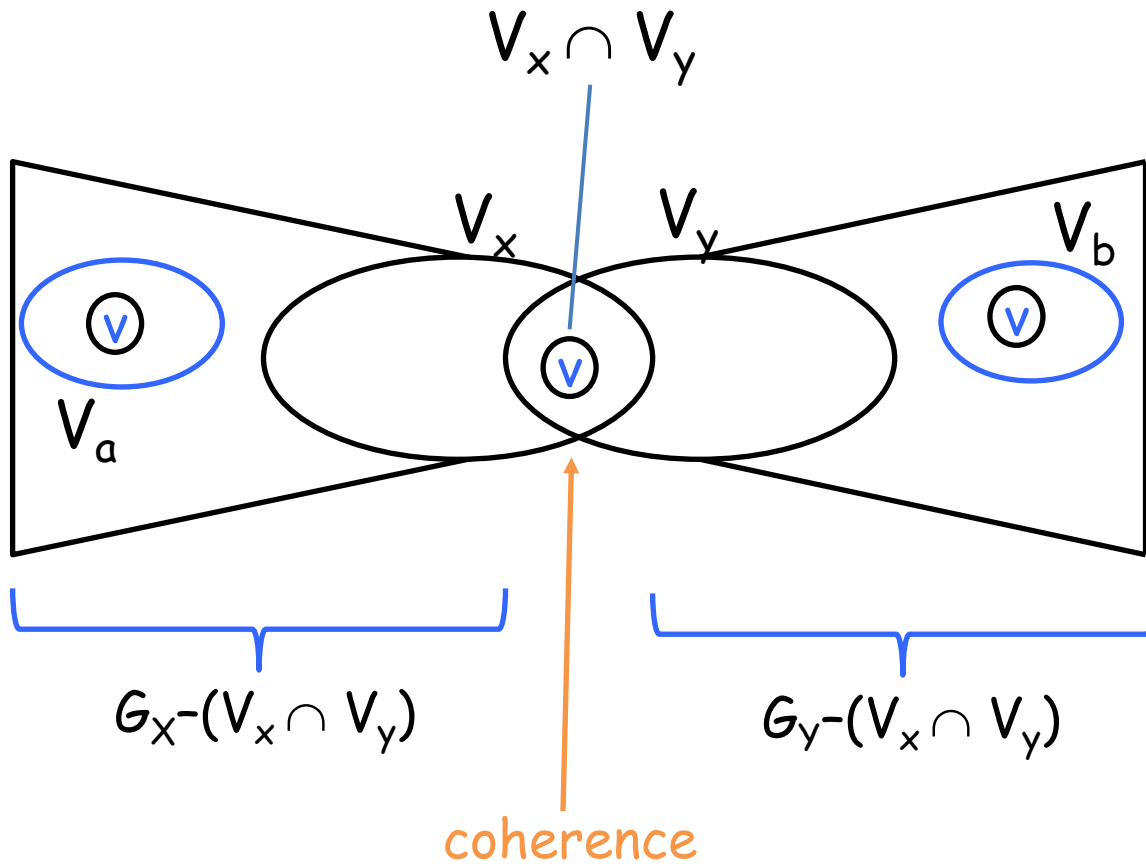
$$G_X - (V_x \cap V_y) \text{ and } G_Y - (V_x \cap V_y)$$

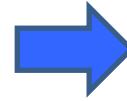
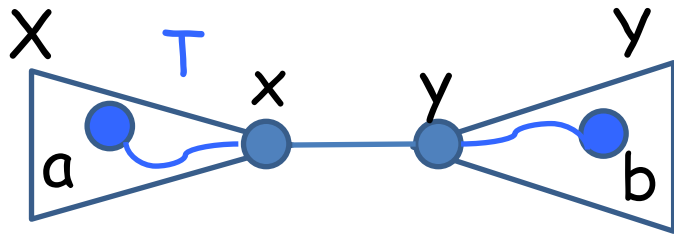
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contradiction!

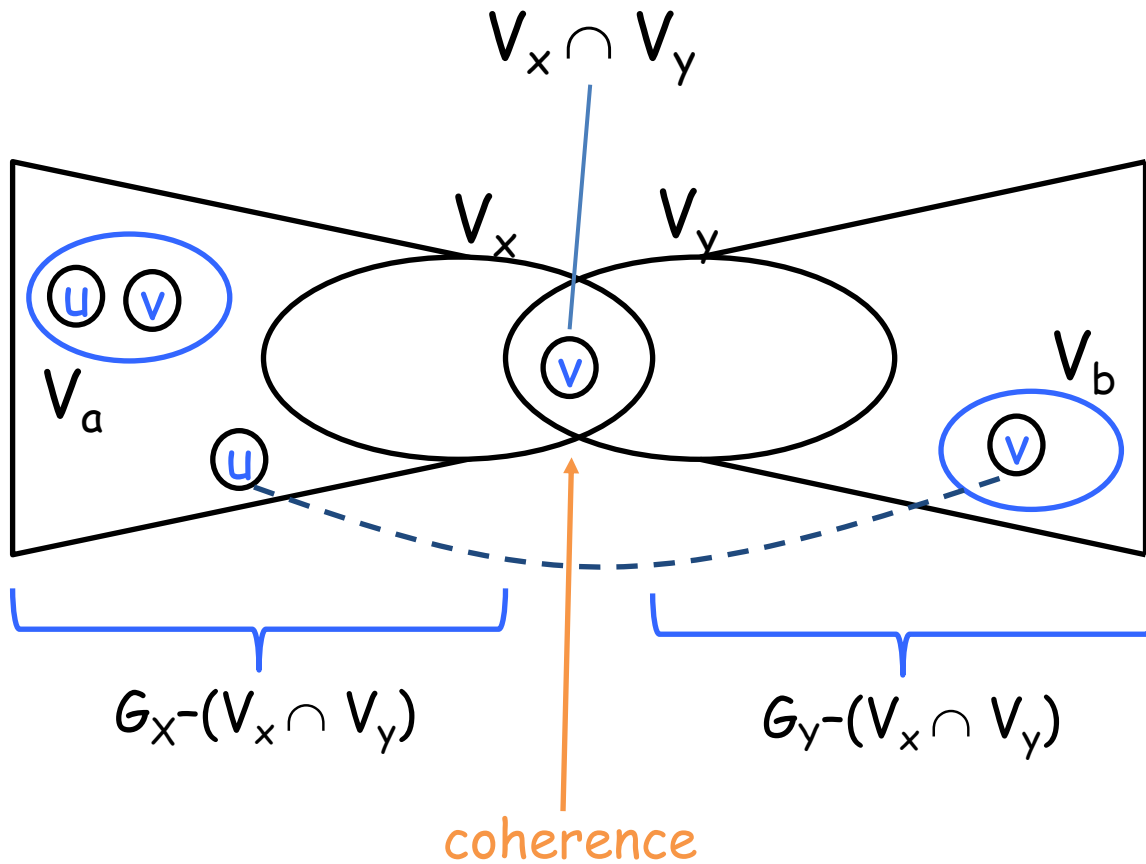
no nodes in
common





contradiction!

no nodes in
common



A tree decomposition $(T, \{V_t : t \in T\})$ is **redundant** if there is an edge (x,y) with $V_x \subseteq V_y$.

obtaining a **nonredundant** tree decomposition:

- whenever a tree decomposition $(T, \{V_t : t \in T\})$ is **redundant**:
- contract the edge (x,y) by folding the piece V_x into the piece V_y .

Lemma

Any **nonredundant** tree decomposition of an n -node graph has at most n pieces.

proof (induction on n .)


$n=1$ is trivial. Let $n > 1$.

consider a leaf t of T and the corresponding V_t

nonredundancy implies there is at least a node in V_t not in the piece of t 's parent (and for coherency in no other piece).

Let U be the set of such nodes

$T-t$ is a nonredundant tree decomposition of $G-U$ with at most

$n - |U| \leq n - 1$ pieces  $(T, \{V_t : t \in T\})$ has at most n pieces



Dynamic Programming on graph with bounded treewidth w

Solving the weighted Independent Set

defining the subproblems

root T at a node r

for any node t ,

- let T_t be the subtree of T rooted at t
- let G_t be the subgraph of G induce by the nodes of all pieces associated with nodes of T_t

subproblems:

for each node t , and each $U \subseteq V_t$:

$f_t(U)$ = maximum weight of an independent set S in G_t , subject to the requirement that $S \cap V_t = U$

obs: $f_t(U) = -\infty$ (or undefined) if U is not an IS

number of subproblems:

2^{w+1} for each node t

$2^{w+1}n$ overall for nonredundant tree decomposition

goal:

compute $\max_{U \subseteq V_r} f_r(U)$

$f_+(U)$ = maximum weight of an independent set S in G_+ , subject to the requirement that $S \cap V_+ = U$

let S be a maximum-weight IS in G_+ subject to the requirement that $S \cap V_+ = U$, that is $w(S) = f_+(U)$

assume that t has children t_1, \dots, t_d :

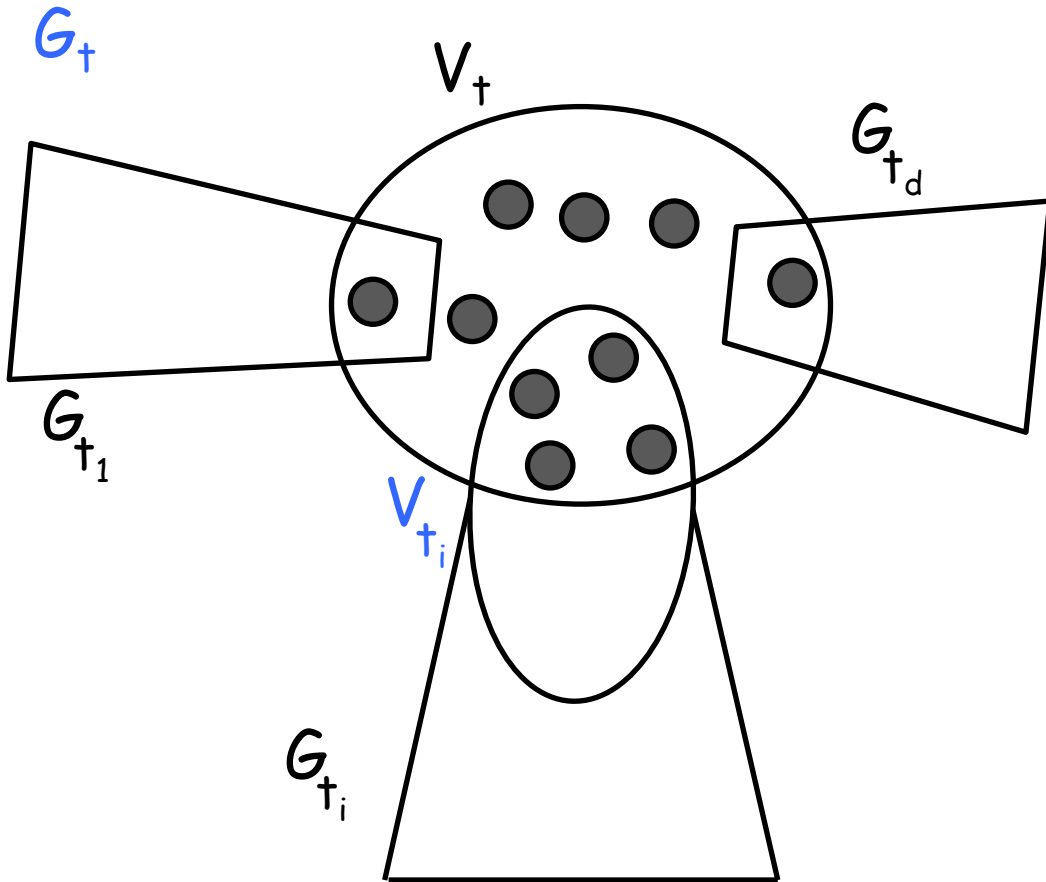
S_i : intersection of S and the nodes of G_{t_i}

Lemma

S_i is a maximum-weight IS of G_{t_i} subject to

$$S_i \cap V_+ = U \cap V_{t_i}$$

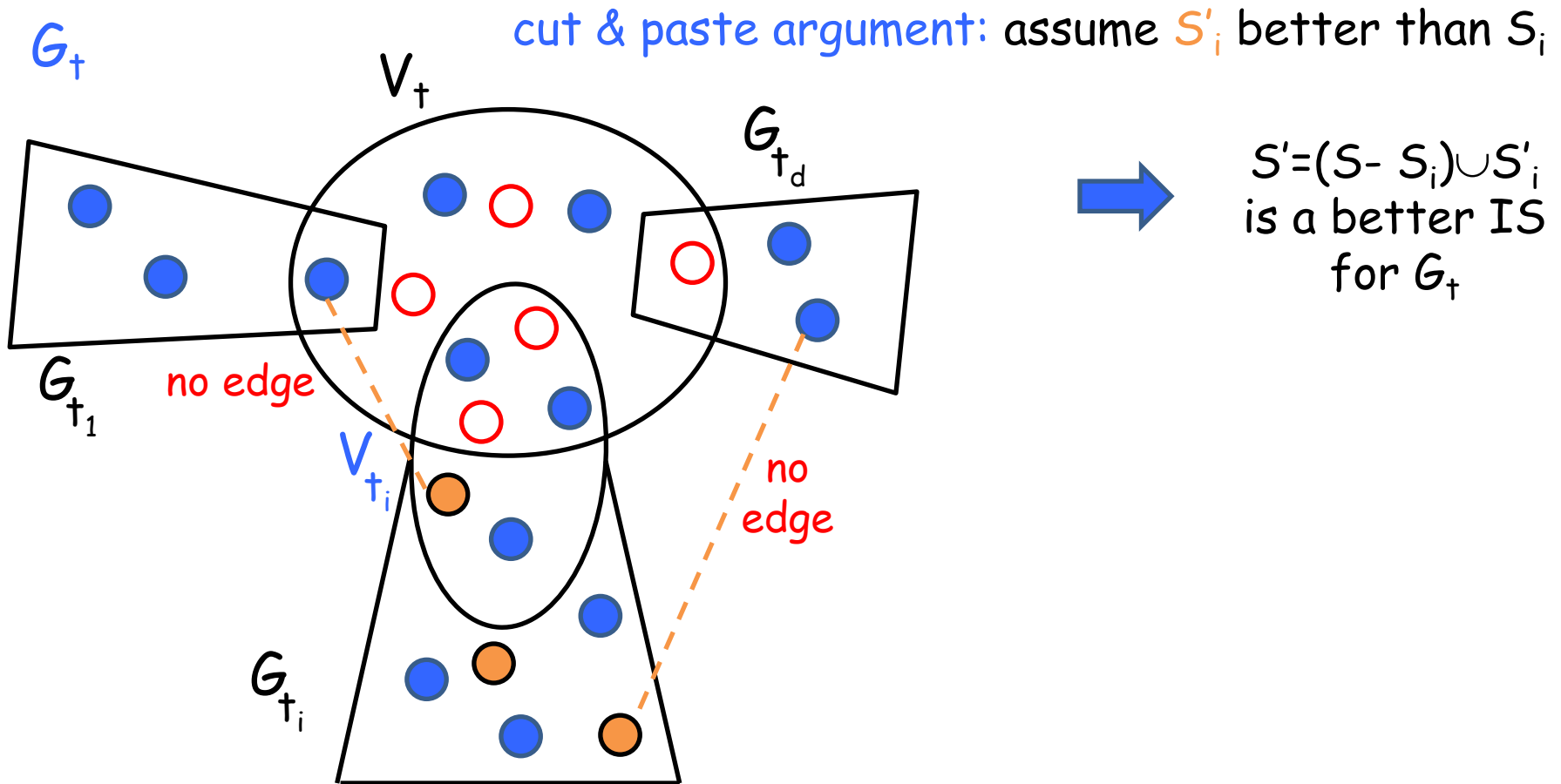
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claim: S_i is opt for G_{t_i} , subject to $S_i \cap V_{t_i} = U \cap V_{t_i}$

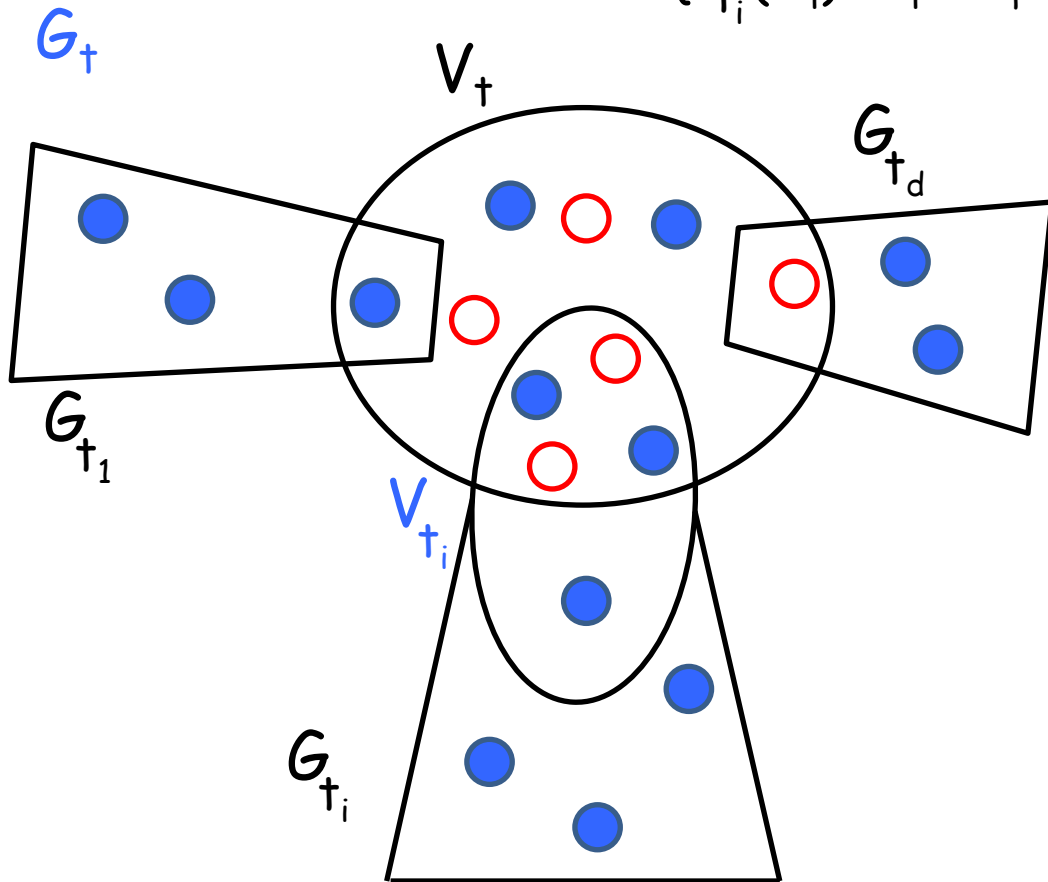


$f_{\dagger}(U)$ = maximum weight of an independent set S in G_{\dagger} , subject to the requirement that $S \cap V_{\dagger} = U$

S_i : intersection of S and the nodes of G_{\dagger_i}

weight of such an optimal S_i :

$$\max\{f_{\dagger_i}(U_i) : U_i \cap V_{\dagger} = U \cap V_{\dagger_i} \text{ and } U_i \subseteq V_{\dagger_i} \text{ is an IS}\}$$



case: t leaf in T

$$f_t(U) = w(U)$$

$U \subseteq V_t$ independent set

case: t has children t_1, \dots, t_d in T

★ $f_t(U) = w(U) + \sum_{i=1}^d \max\{ f_{t_i}(U_i) - w(U_i \cap U) : U_i \cap V_t = U \cap V_{t_i} \text{ and } U_i \subseteq V_{t_i} \text{ is an IS } \}$

To find a maximum-weight independent set of G ,
given a tree decomposition $(T, \{V_t\})$ of G :

Modify the tree decomposition if necessary so it is nonredundant

Root T at a node r

For each node t of T in post-order

 If t is a leaf then

 For each independent set U of V_t

$$f_t(U) = w(U)$$

 Else

 For each independent set U of V_t

$f_t(U)$ is determined by the recurrence



 Endif

Endfor

Return $\max \{f_r(U) : U \subseteq V_r \text{ is independent}\}$.

case: t leaf in T

$U \subseteq V_t$ independent set

$$f_t(U) = w(U)$$

case: t has children t_1, \dots, t_d in T

$$\star f_t(U) = w(U) + \sum_{i=1}^d \max\{ f_{t_i}(U_i) - w(U_i \cap U) : U_i \cap V_t = U \cap V_{t_i} \text{ and } U_i \subseteq V_{t_i} \text{ is an IS } \}$$

time to compute $f_t(U)$:

for each of the d children t_i and each $U_i \subseteq V_{t_i}$

- check in time $O(w)$ if U_i is an IS and is consistent with V_t and U $O(2^{w+1} w d)$

there are 2^{w+1} possible U for a node t : $O(4^{w+1} w d)$

summing over all nodes t :

total running time:

$$O(4^{w+1} w n)$$

How to compute a tree-decomposition?

Compute the treewidth of a given graph is NP-hard



There is an algorithm that, given a graph with treewidth w , produce a tree decomposition with width $4w$ in time $O(f(w) mn)$

