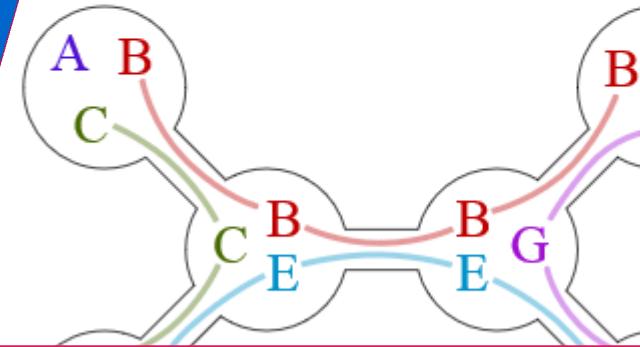
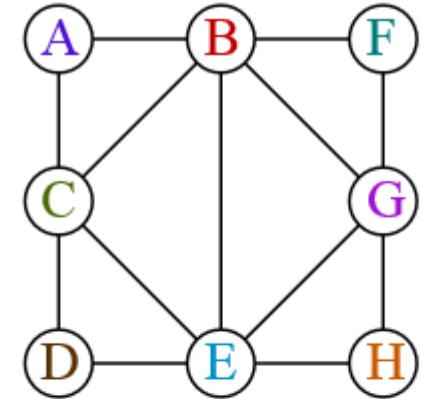


Structural graph parameters

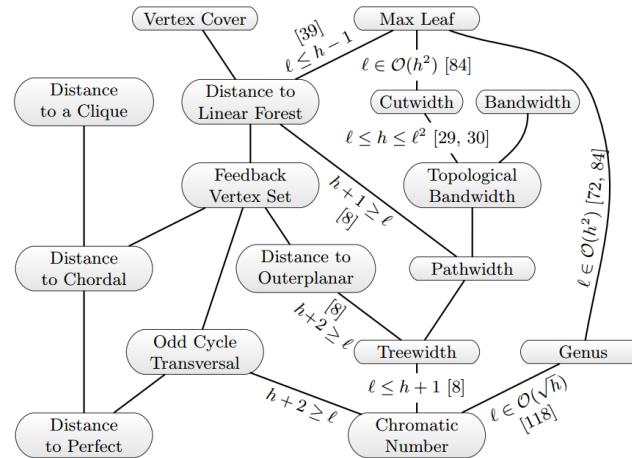
PART 1: TREewidth

Bart M. P. Jansen (edited by mjd -2021)



The goal for this micro-course

1. Introduce & motivate structural parameters of graphs
 - *Different ways of measuring the complexity of a graph*
2. Relate these parameters to each other



3. Use this hierarchy of parameters as a methodology for generating & answering meaningful research problems

The plan for this micro-course

Monday:

Introduction to graph parameters & exploring treewidth

Wednesday:

More parameters & relations between them

Thursday:

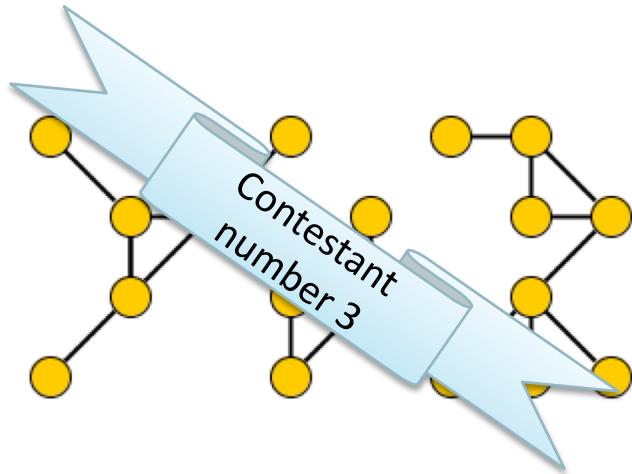
Applications to combinatorics & algorithmics

To get all noses in the same direction

All my graphs are finite

- ... simple
- ... and undirected ($\text{edge } uv = \text{edge } vu$)

Interrupt me any time!

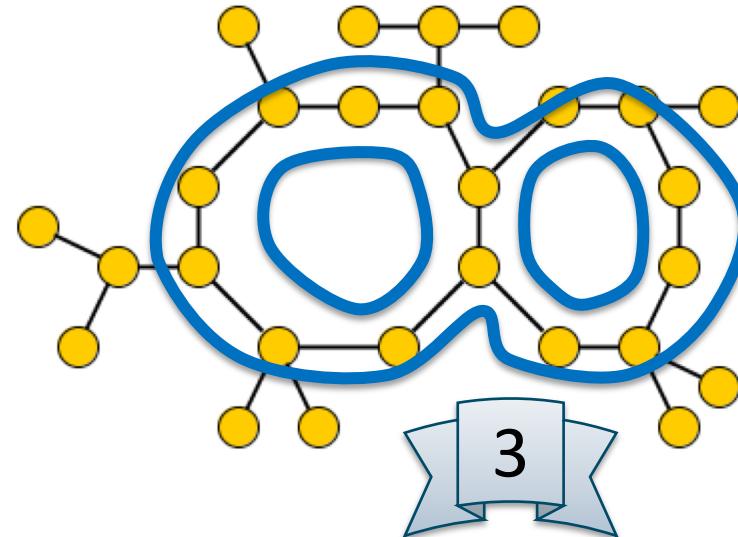
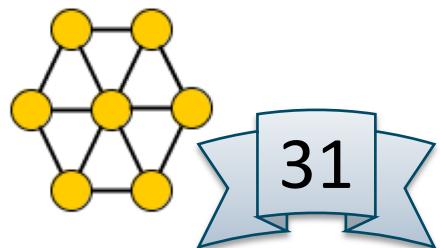
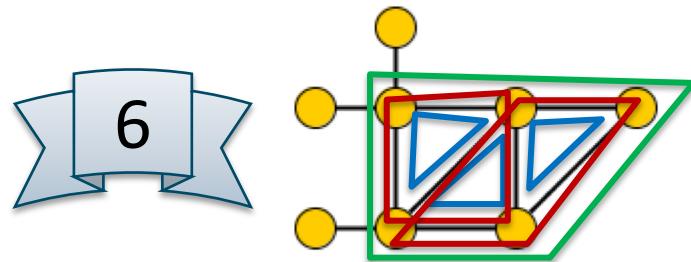
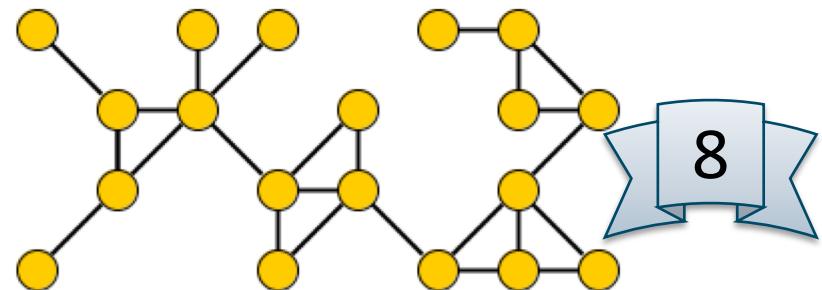
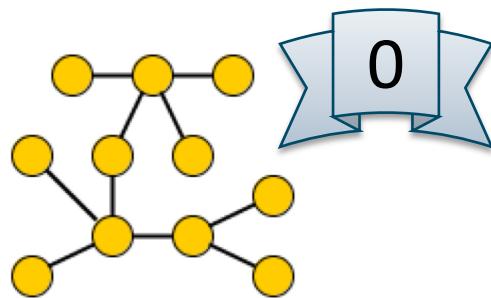


A BEAUTY CONTEST FOR GRAPHS

complexity

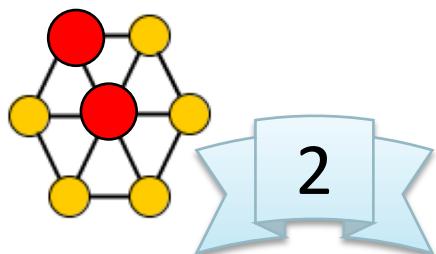
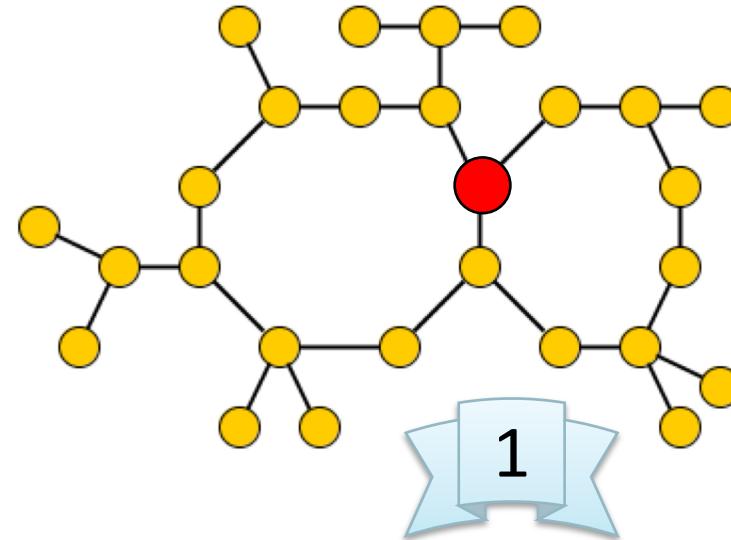
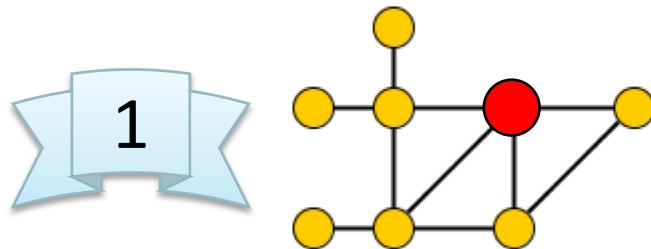
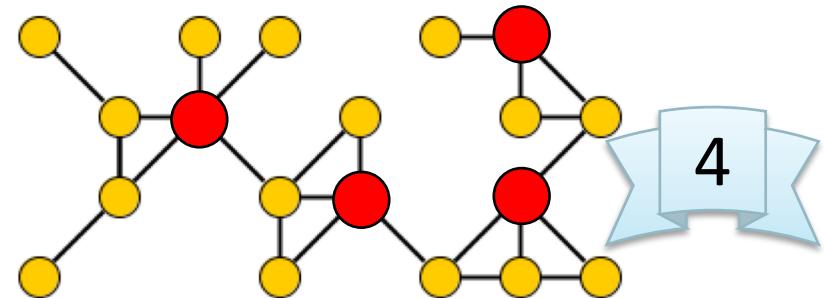
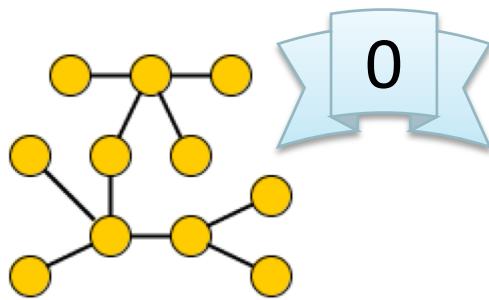
A complexity contest for graphs – Judge #1

Number of cycles



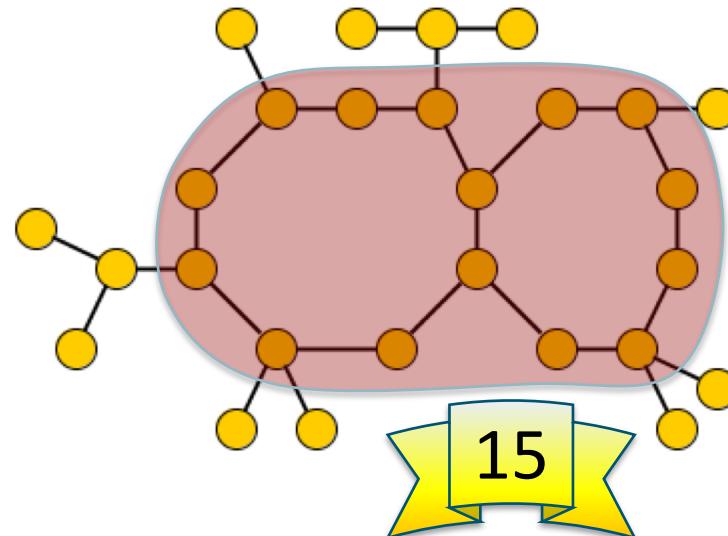
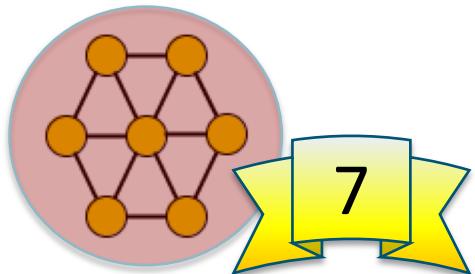
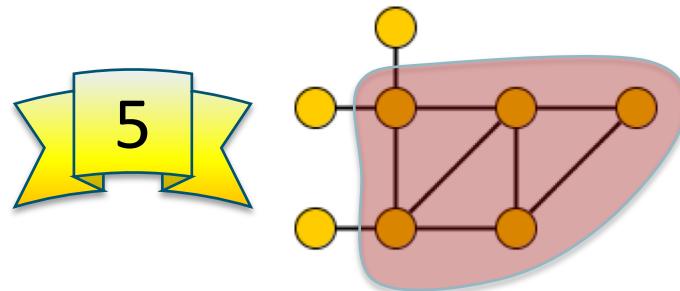
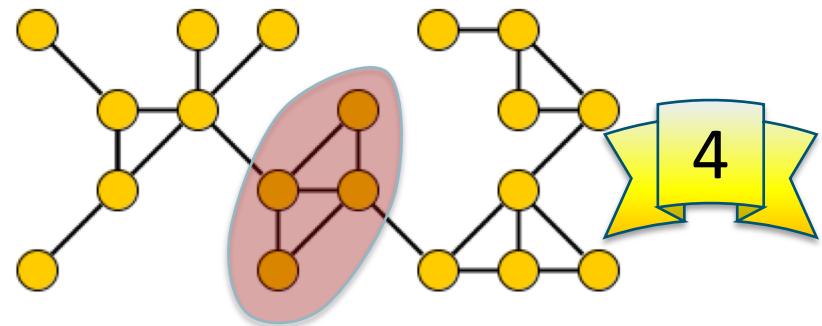
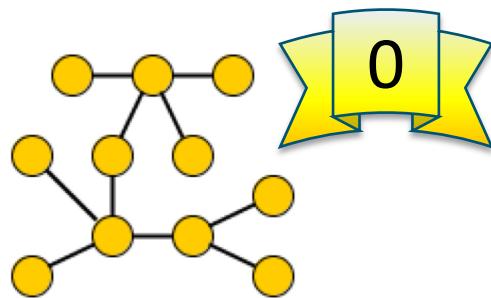
A complexity contest for graphs – Judge #2

Vertex-deletion
distance to acyclic



A complexity contest for graphs – Judge #3

Length of
longest cycle



Measuring graph complexity

Number of cycles

Vertex-deletion
distance to acyclic

Length of
longest cycle



Feedback vertex
number

Circumference

These are **graph parameters**:
functions assigning integers to abstract graphs

These 3 parameters give value 0 to all trees

Which parameter captures graph complexity in a useful way?

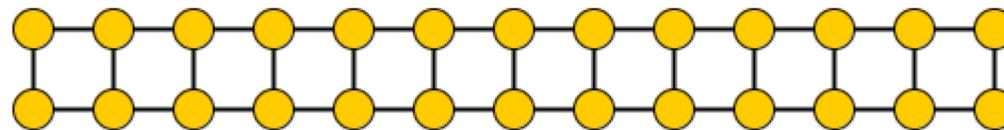
Complexity of a ladder graph

Number of cycles

Vertex-deletion
distance to acyclic

Length of
longest cycle

None of these, really: ladder graphs score arbitrarily high

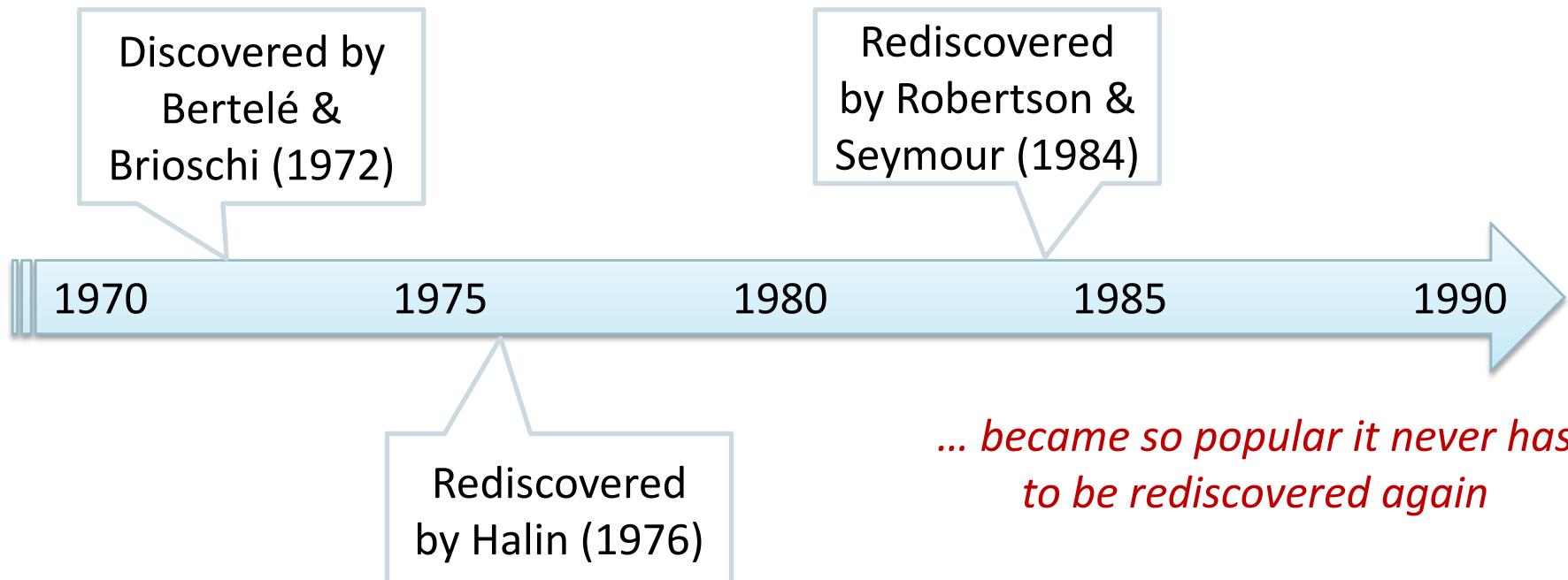


Which parameter captures graph complexity in a useful way?

TREEDWIDTH

History

The **treewidth** of a graph is a useful graph complexity parameter
*Intuitively: measures how **treelike** the graph is*



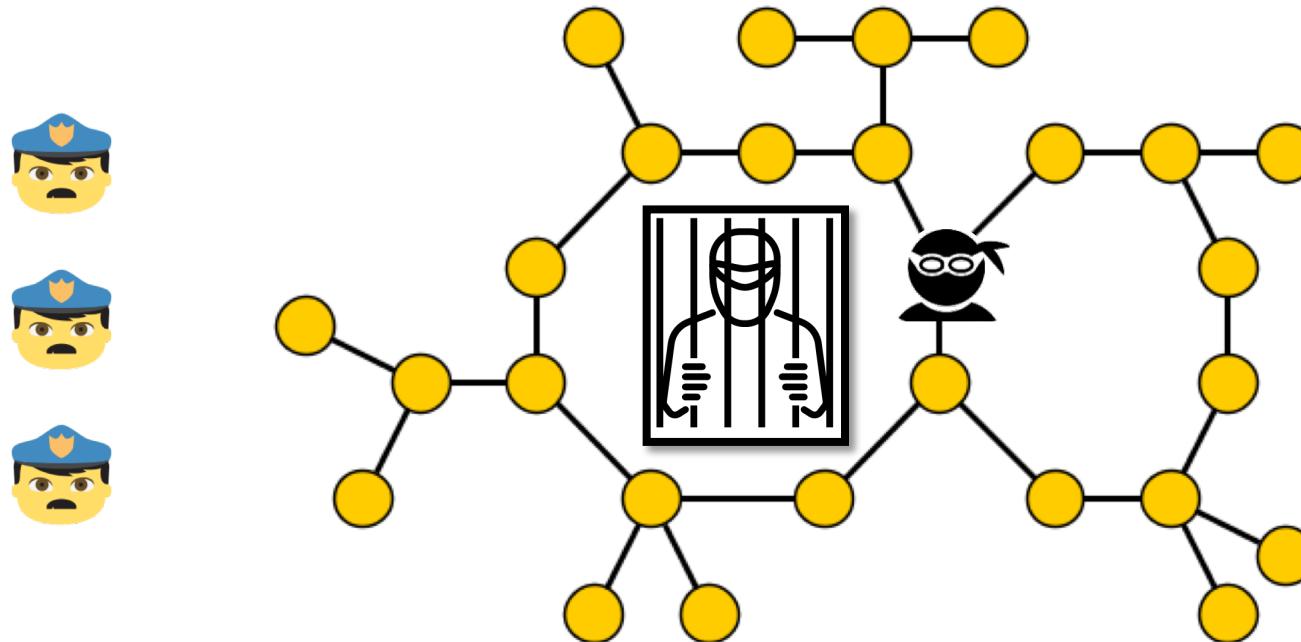
Definition of treewidth

Many cryptomorphic equivalent definitions of treewidth:

1. Minimum width of a tree decomposition
2. Minimum clique number of a chordal supergraph
3. Minimum cost of an elimination order
4. Minimum k for which the graph is a partial k -tree
5. Minimum number of cops needed to catch a visible robber

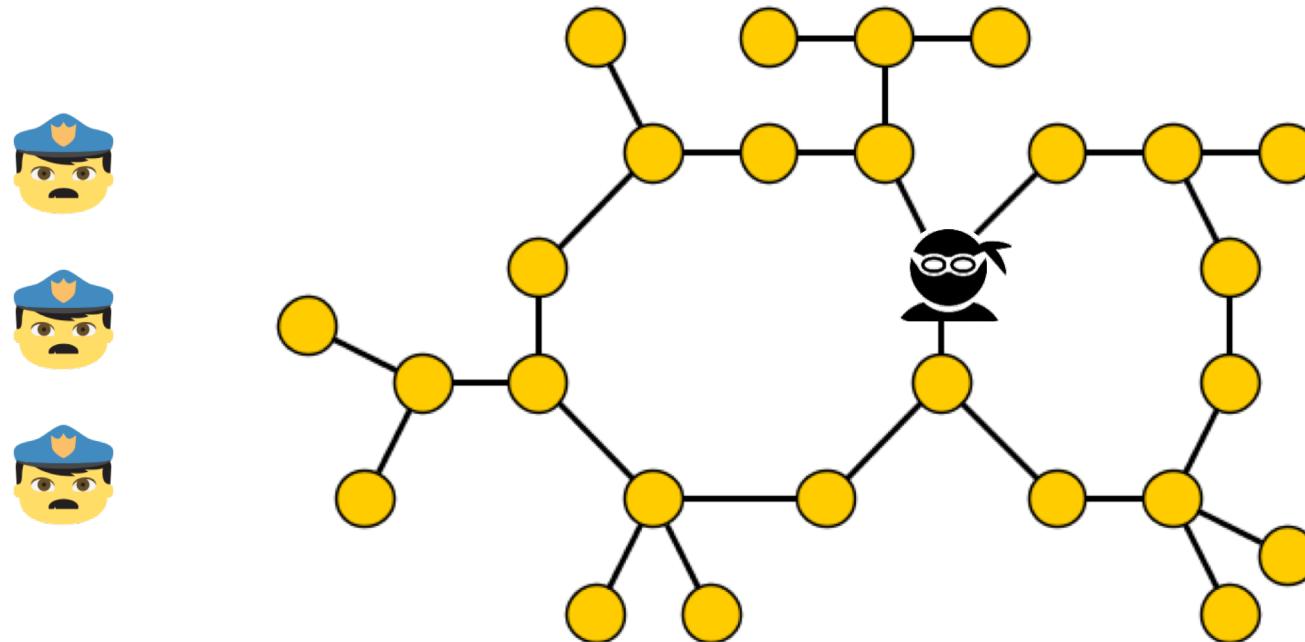
Cops and robbers on graphs

- Fast robber is running along the edges of a graph
- Cops in a helicopter try to catch him by landing and blocking vertices
- Helicopters are slow: robber sees helicopter coming and runs away



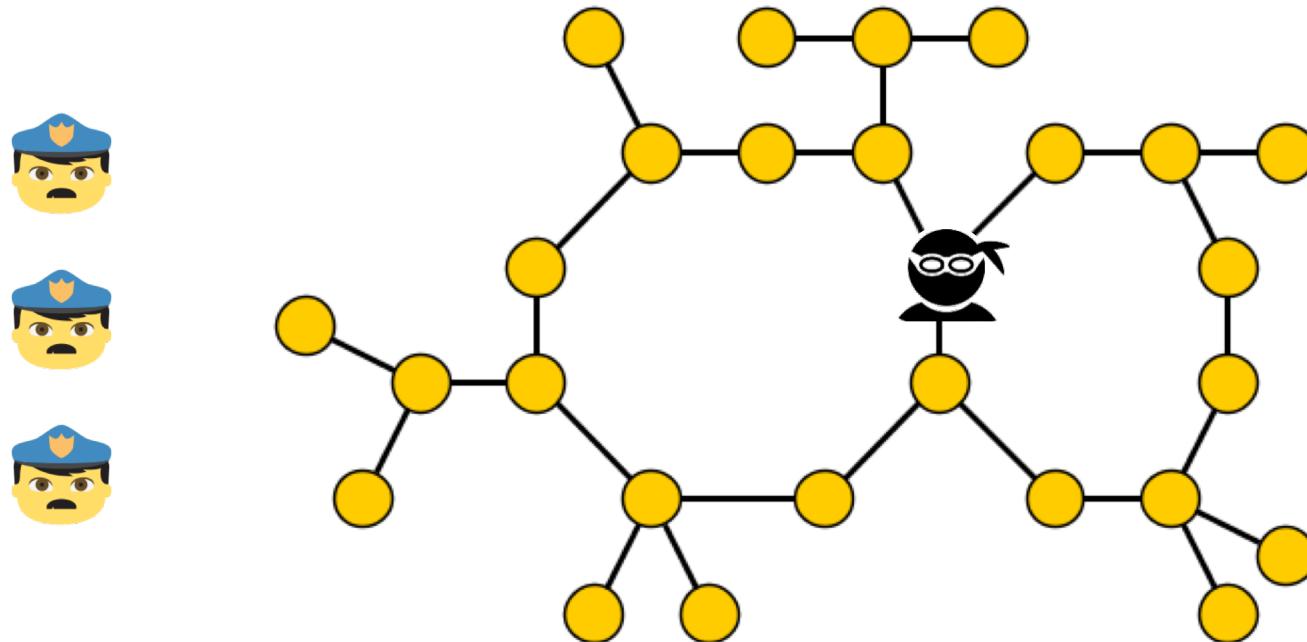
Graph parameter from cops and robbers

What is the smallest number of cops needed to catch any robber on G ?



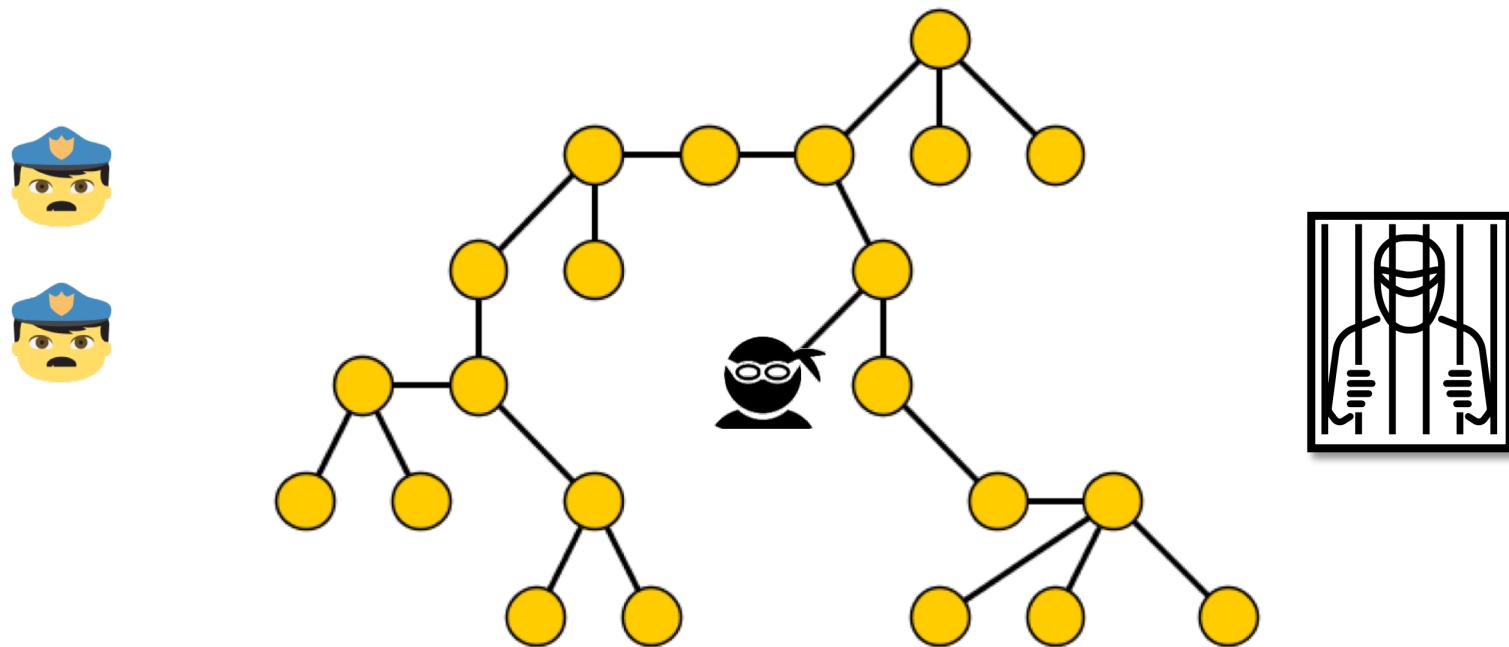
Robbers can hide on cycles

Fact. For any graph with a cycle, you need at least 3 cops.

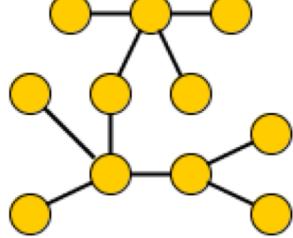


Robbers cannot hide on trees

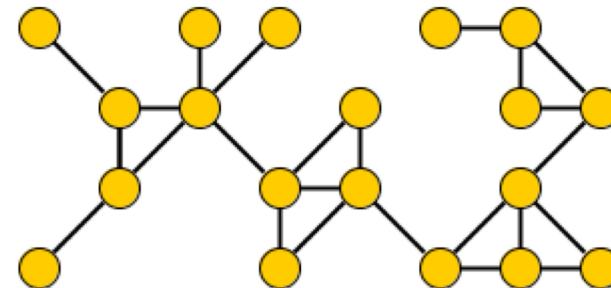
Fact. In a tree, 2 cops can catch any robber.



Catching robbers on the contest graphs



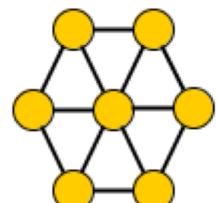
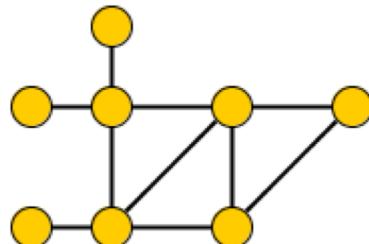
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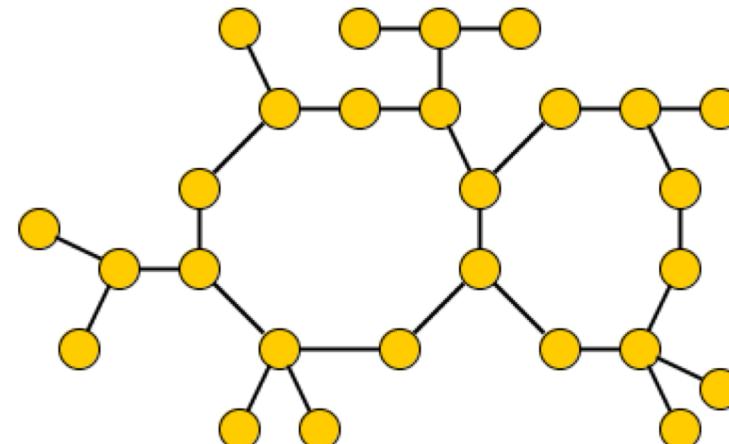
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3



4



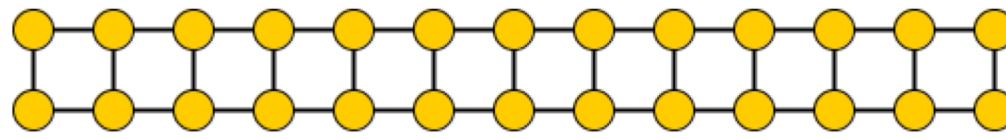
3

Catching robbers on ladder graphs

Number of cycles

Vertex-deletion
distance to acyclic

Length of
longest cycle



In a ladder graph, 3 cops can catch any robber

Cop number versus other parameters

Number of cycles

Vertex-deletion
distance to acyclic

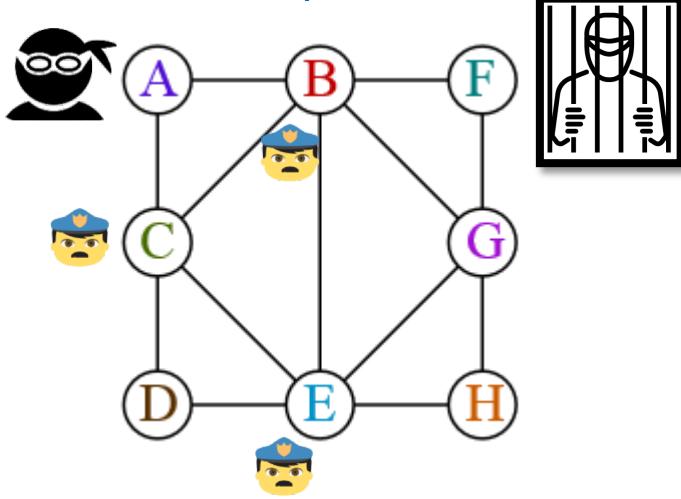
Length of
longest cycle

- I. $\text{CopNumber}(G) \leq \text{NumberOfCycles}(G) + 2$
- II. $\text{CopNumber}(G) \leq \text{DistanceToAcyclic}(G) + 2$
- III. $\text{CopNumber}(G) \leq \text{LongestCycle}(G)$

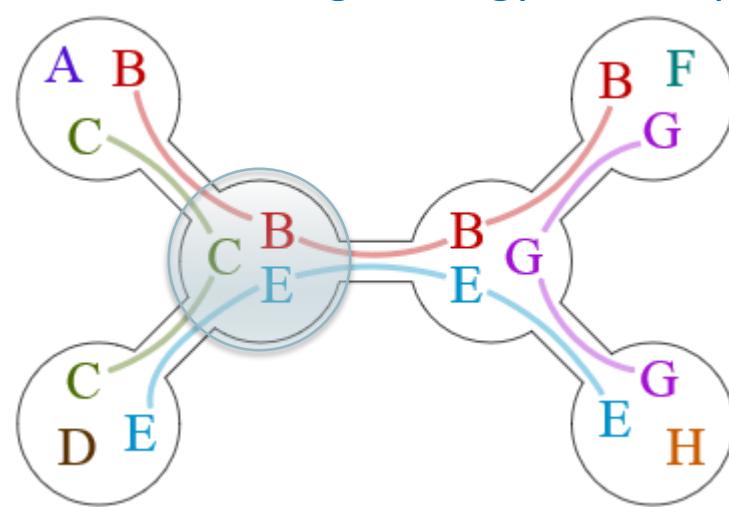
The cop number is small on a larger class of graphs ...
yet graphs with small cop number still have useful structure

Representing search strategies

Graph G



Tree T encoding strategy for 3 cops



Each node $v \in V(T)$ gives cop-occupied positions in state v

1. Start with cops in locations specified by start node (arbitrary)
2. Consider $x \in V(G)$ that robber runs to, find x in T
3. Change cop state as indicated by tree-neighbor towards x

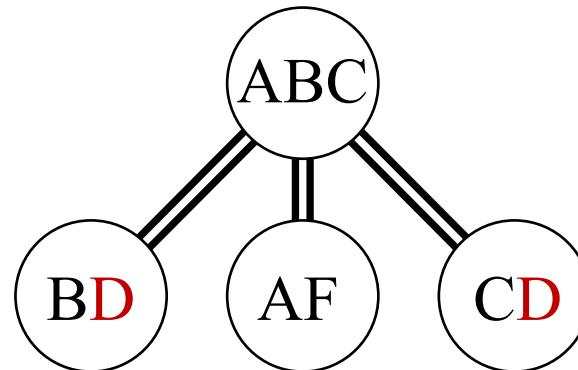
Which trees represent valid strategies?

To be able to catch a robber hiding along edge uv :

- A. $\forall uv \in E(G)$, some state has **simultaneous cops** on u and v

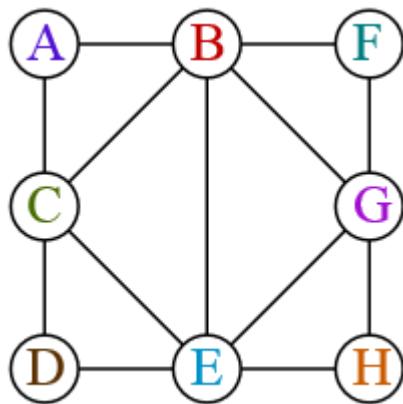
To ensure next cop move is well-defined:

- B. $\forall v \in V(G)$, states with v -cop form **connected subtree** of T

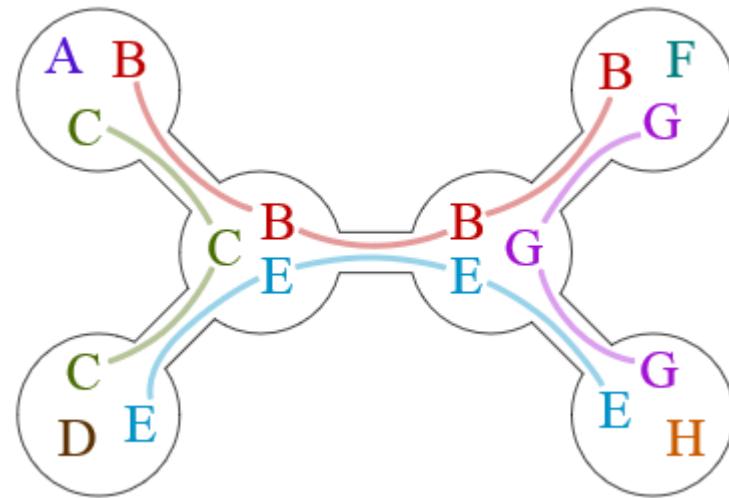


Representing search strategies

Graph G



Tree T encoding strategy for 3 cops

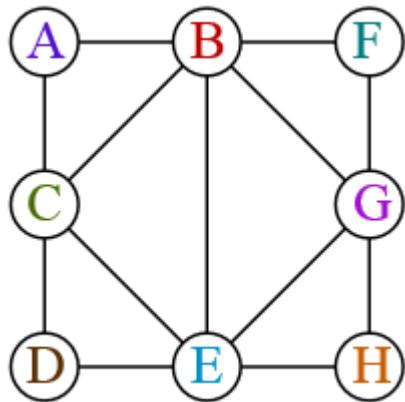


- A. $\forall uv \in E(G)$, some state has simultaneous cops on u and v
- B. $\forall v \in V(G)$, states with v -cop form connected subtree of T

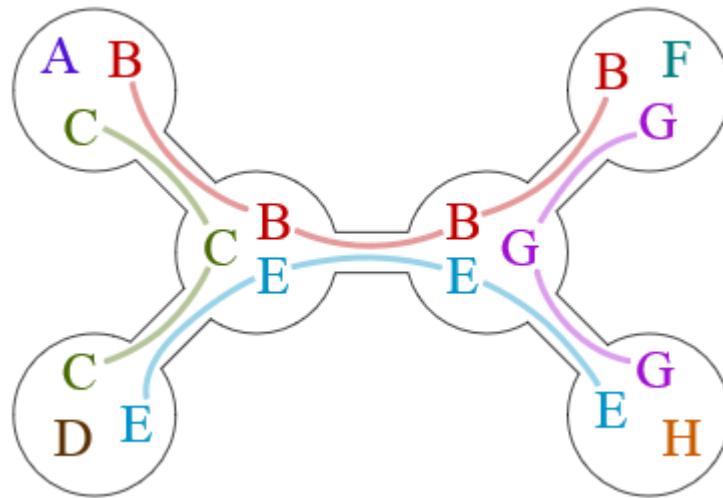
Necessary conditions (A),(B) are sufficient to ensure validity.
There is always an optimal strategy of this form.

Tree decompositions

Graph G



Tree decomposition (T, X)



A **tree decomposition** of G is a pair (T, X) where T is a tree and X assigns a **bag** $X(w) \subseteq V(G)$ to each $w \in V(T)$, such that:

- A. $\forall uv \in E(G)$, some bag $X(w)$ contains both u and v
- B. $\forall v \in V(G)$, bags containing v form **connected** subtree of T

Treewidth

The **width** of a tree decomposition is the maximum bag size – 1

The **treewidth** of G is the min. width of its tree decompositions

Theorem. Graph G has treewidth at most $k - 1$

\Leftrightarrow

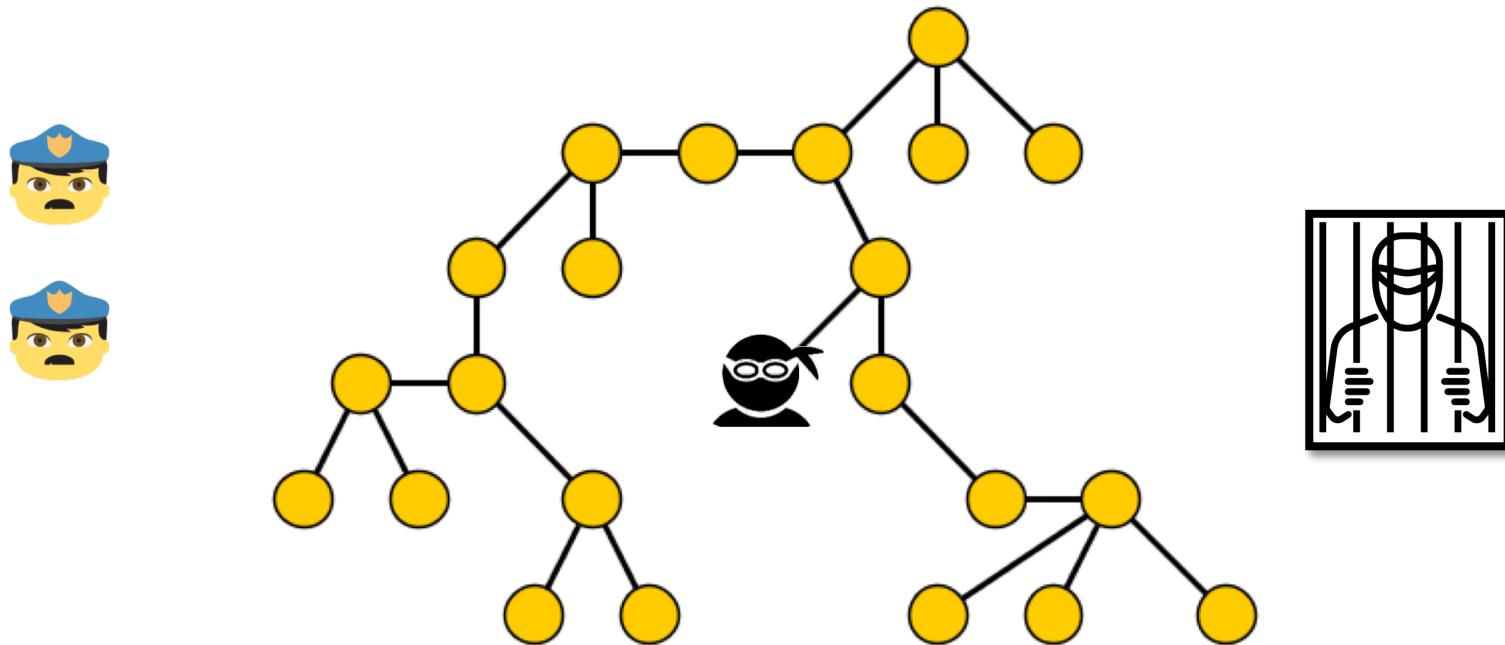
k cops are sufficient to catch any robber on G .

A **tree decomposition** of G is a pair (T, X) where T is a tree and X assigns a **bag** $X(w) \subseteq V(G)$ to each $w \in V(T)$, such that:

- $\forall uv \in E(G)$, some bag $X(w)$ contains both u and v
- $\forall v \in V(G)$, bags containing v form **connected** subtree of T

Robbers cannot hide on trees

Fact. A tree has treewidth 1.



Connected subgraphs yield connected subtrees

For $v \in V(G)$ let $X^{-1}(v)$ be the nodes of T whose bag contains v

For $S \subseteq V(G)$ let $X^{-1}(S)$ be the nodes of T whose bag intersects S

Lemma 1. If H is a connected subgraph of G ,
then $X^{-1}(V(H))$ is a connected subtree of T .

A **tree decomposition** of G is a pair (T, X) where T is a tree and X assigns a **bag** $X(w) \subseteq V(G)$ to each $w \in V(T)$, such that:

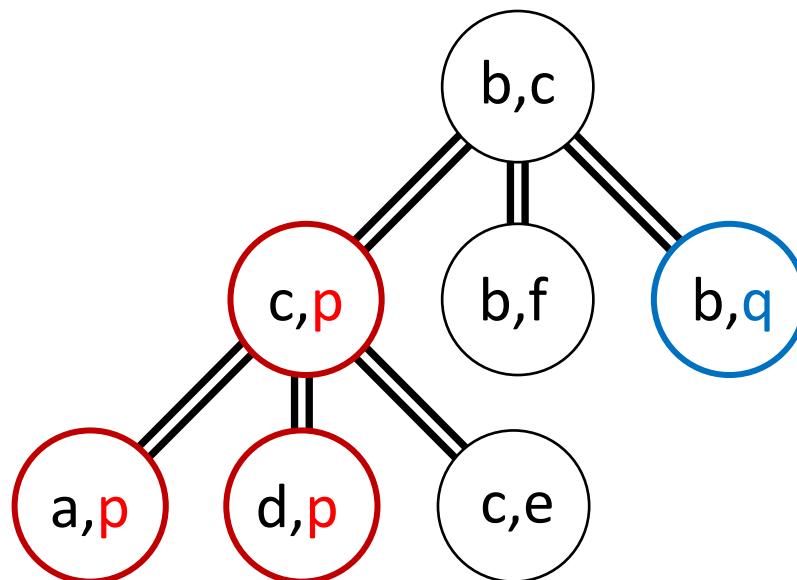
- A. $\forall u, v \in E(G)$, some bag $X(w)$ contains both u and v
- B. $\forall v \in V(G)$, bags containing v form **connected** subtree of T

PROPERTIES OF TREewidth

Bags of the decomposition form separators

Lemma 1. If H is a connected subgraph of G , then $X^{-1}(V(H))$ is a connected subtree of T .

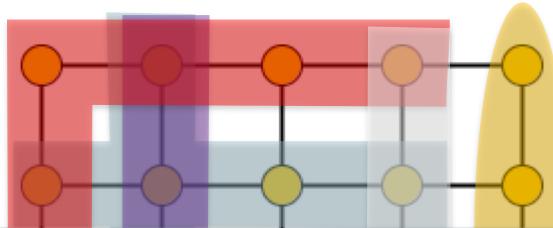
Let (T, X) be a tree decomposition of G . Let $p, q \in V(G)$. Let $w \in V(T)$ such that all paths from $X^{-1}(p)$ to $X^{-1}(q)$ in T go through node w . Then all paths from p to q in G intersect $X(w)$.



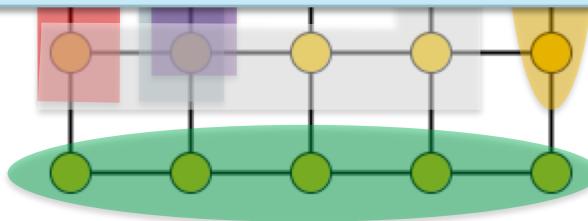
Implies robber will be caught

The treewidth of a grid

How many cops are needed to catch a robber on the $k \times k$ grid?



Lemma. The treewidth of a $k \times k$ grid is exactly k .

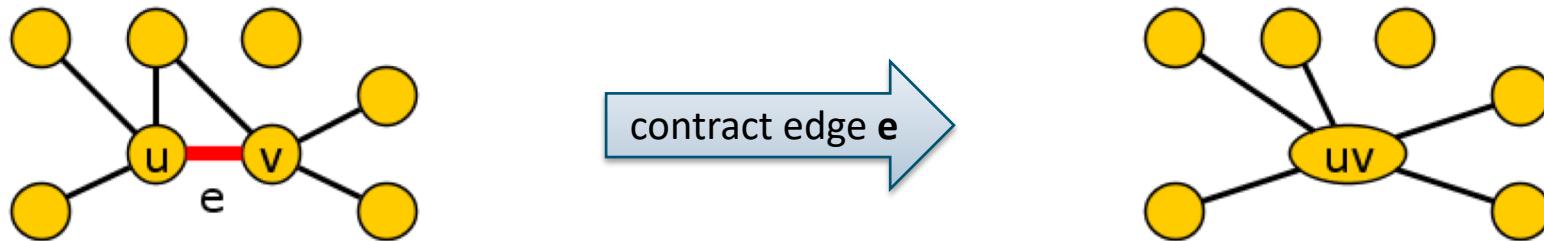


Robber can hide from k cops on the following subgraphs:

bottom row, remainder of last column,
and all “crosses” in the top-left $(k - 1) \times (k - 1)$ grid
including off-diagonal ones

Contracting edges does not increase treewidth

Lemma. If graph H can be obtained from G by a sequence of *edge deletions, vertex deletions, and edge contractions*, then H is a **minor** of G and $\text{treewidth}(H) \leq \text{treewidth}(G)$.



Corollary. If you can obtain a $k \times k$ grid from G by deleting edges, deleting vertices, and contracting edges, then $\text{treewidth}(G) \geq \text{treewidth}(\boxplus_{k \times k}) = k$.

The excluded grid theorem

Corollary. If contains a $k \times k$ grid as a minor,
then $\text{treewidth}(G) \geq k$.

In some sense, large grid minors are the **only** reason for large TW

Excluded grid theorem. [RS'86, RST'94, KK'12, LS'14, CC'14, Chuzhoy'16]
If $\text{treewidth}(G) = k$, then G contains a $k' \times k'$ grid as a minor,
where $k' \in \Omega\left(k^{\frac{1}{20}}\right)$.

Balanced separators from tree decompositions

Lemma. If the n -vertex graph G has treewidth k , then there is a **separator** $S \subseteq V(G)$ of size $k + 1$ such that each connected component of $G - S$ has at most $\frac{n}{2}$ vertices.

Proof.

1. Consider tree decomposition (T, X) of G
2. Pick a root node r for T . Then for each node $v \in V(T)$:
 - Let T_v be the subtree of T rooted at v
 - Let $X(T_v) := \bigcup_{u \in V(T_v)} X(u)$ be vertices of G in bags of T_v
3. Pick deepest $v \in V(T)$ such that $|X(T_v)| > \frac{n}{2}$, use $S := X(v)$

EXERCISES ON TREewidth

Small-treewidth graphs have a low-degree vertex

Lemma. If G has treewidth k ,
then G has a vertex of degree at most k .

Proof strategies:

1. If $k + 1$ cops can catch any robber on G , it has a deg- k vertex
2. Find a degree- k vertex by inspecting leaves of decomposition

Corollary.

An n -vertex graph of treewidth k has at most nk edges.

Cliques are represented in tree decompositions

Lemma. If $S \subseteq V(G)$ forms a clique in G , then any tree decomposition for G has a bag containing all vertices of S .



Helly property. If T is a tree and T_1, \dots, T_k are connected subgraphs of T such that $V(T_i) \cap V(T_j) \neq \emptyset$ for all $1 \leq i, j \leq k$, then $V(T_1) \cap V(T_2) \cap \dots \cap V(T_k) \neq \emptyset$.

Corollary.

If G has a clique of size k , then $\text{treewidth}(G) \geq k - 1$.

CLOSING REMARKS

An arboretum of graphs of bounded treewidth

series-parallel
graphs
(treewidth ≤ 2)

k -outerplanar
graphs

k vertex-
deletions away
from acyclic

Summary

Treewidth is a graph parameter measuring treelike-ness

- Definition in terms of [tree decompositions](#)
- Definition in terms of cops [catching a fast robber](#)

Concept of treewidth gives a [research methodology](#)

- Generalize results on trees to bounded-treewidth graphs

Graphs of treewidth k are more general than:

- Graphs with k cycles
- Graphs that are k vertex-deletions away from acyclic

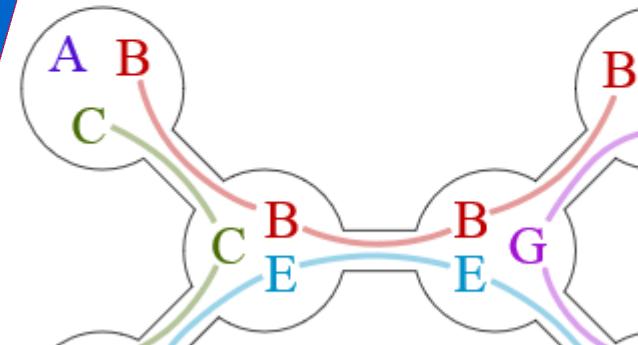
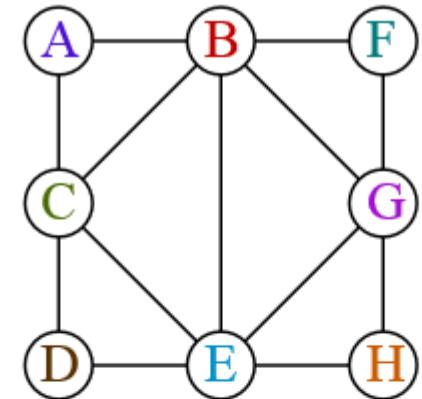
More parameters [Wednesday](#), applications on [Thursday](#)



Structural graph parameters

PART 2: A HIERARCHY OF PARAMETERS

Bart M. P. Jansen (edited by mjd – 2021)



Recap

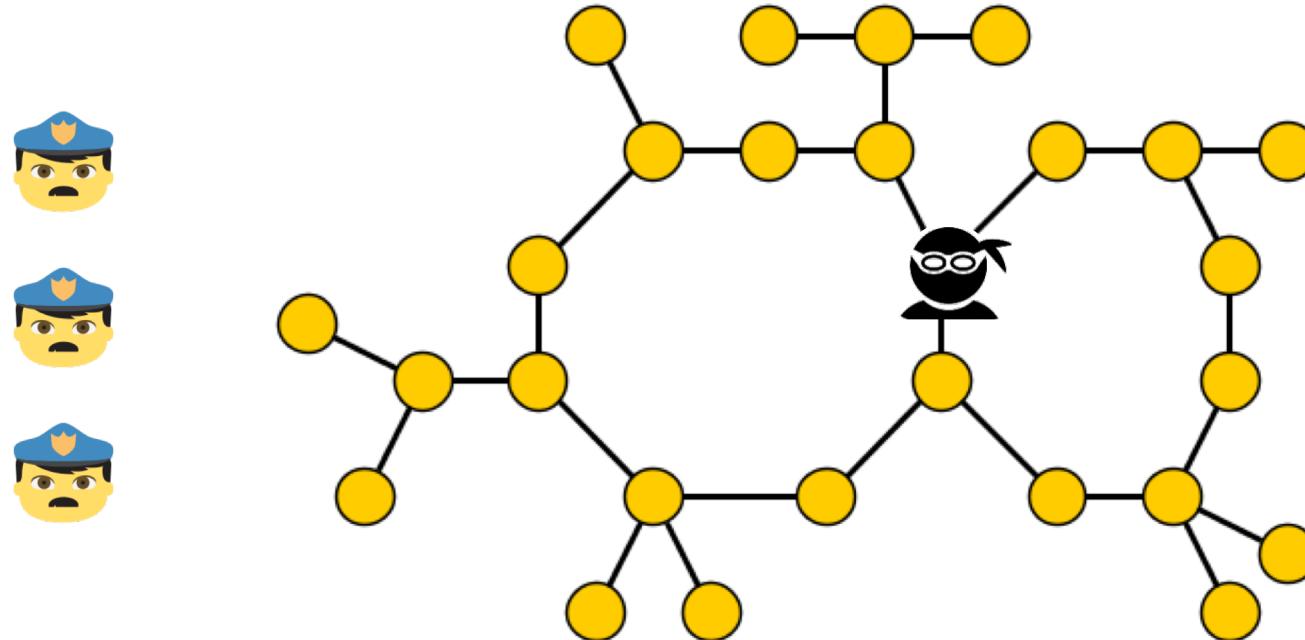
Yesterday we explored **treewidth** and 3 other graph parameters:

1. Number of cycles
2. Vertex-deletion distance to an acyclic graph
3. Length of the longest cycle
4. Treewidth = number of cops to catch a fast robber – 1



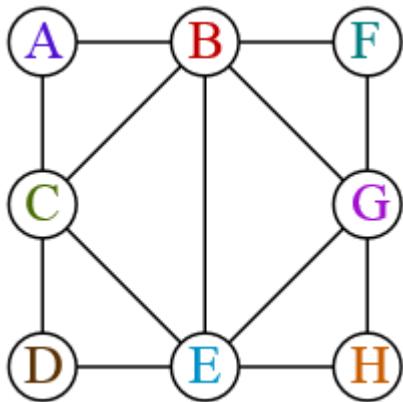
Cops and robbers on graphs

- Fast robber is running along the edges of a graph
 - Cops in a helicopter try to catch him by landing and blocking vertices
 - Helicopters are slow: robber sees helicopter coming and runs away

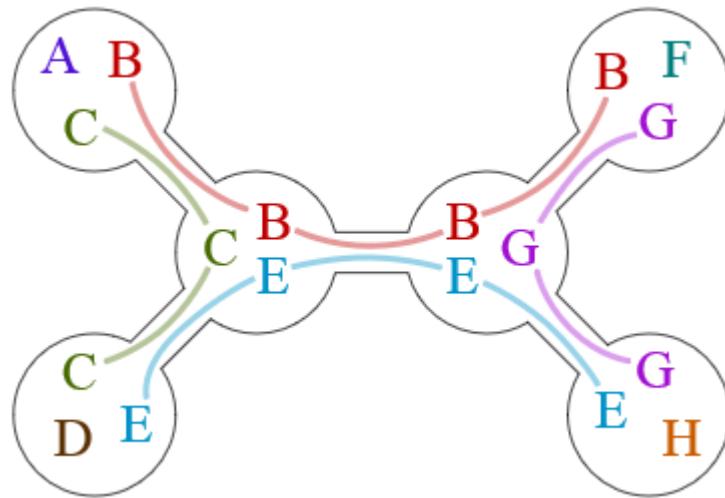


Tree decompositions

Graph G



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Treewidth

The **width** of a tree decomposition is the maximum bag size – 1

The **treewidth** of G is the min. width of its tree decompositions

Theorem. Graph G has treewidth at most $k - 1$

\Leftrightarrow

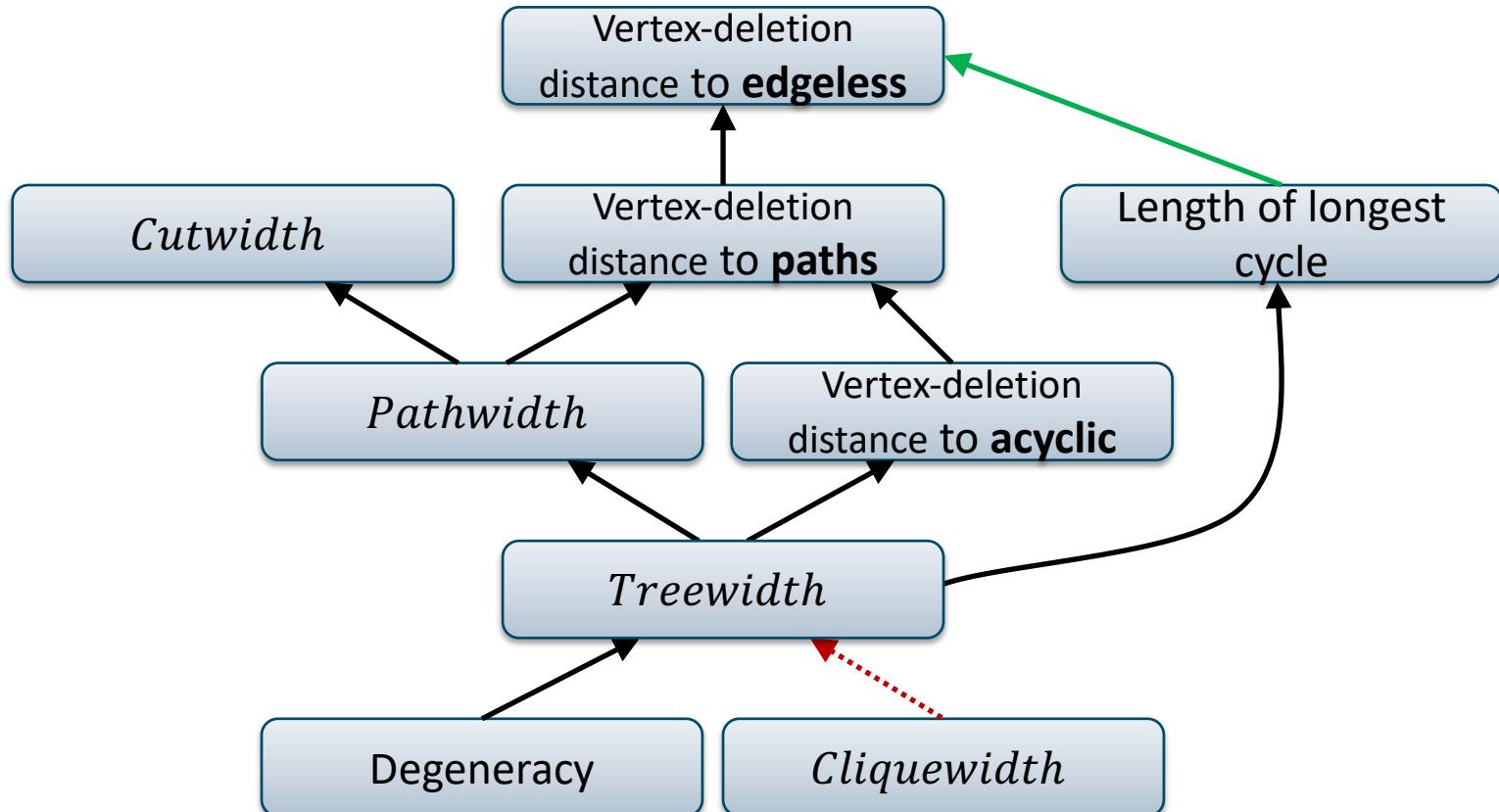
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Plan for today

More graph parameters and relations between them



Methodology for generating graph problems & solving them

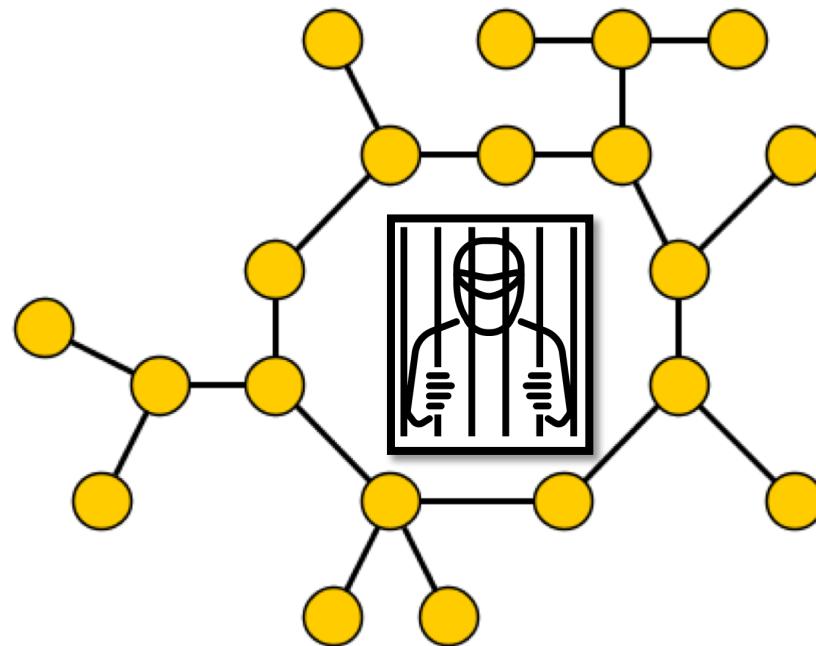


A NEW PARAMETER

Catching a special robber

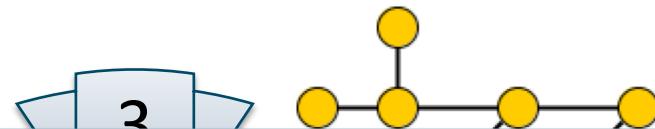
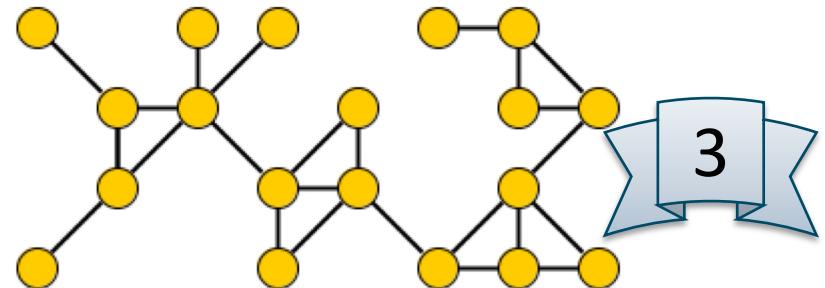
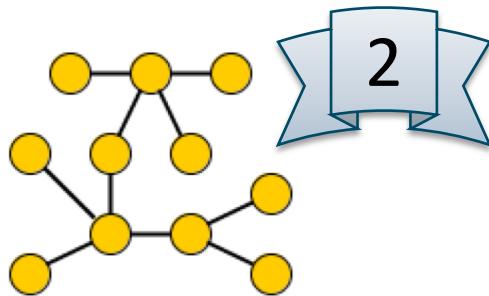
- In the game defining treewidth, cops are slow but can see the fast robber
- For the next parameter, we change the rules of the game:

What if the robber is a fast invisible man?

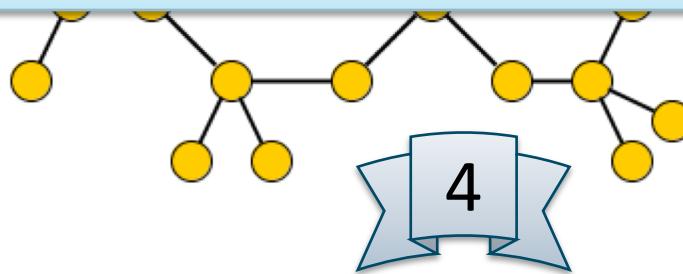
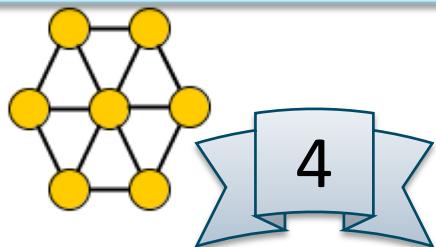


Catching invisible robbers on the contest graphs

Number of cops to
catch invisible robber

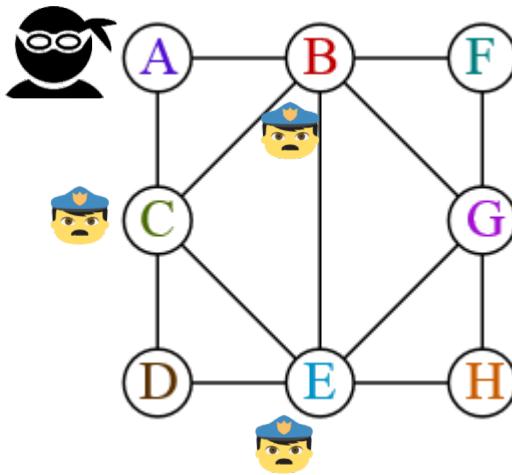


Observation. To catch an invisible robber,
you need a fixed strategy for searching the graph.

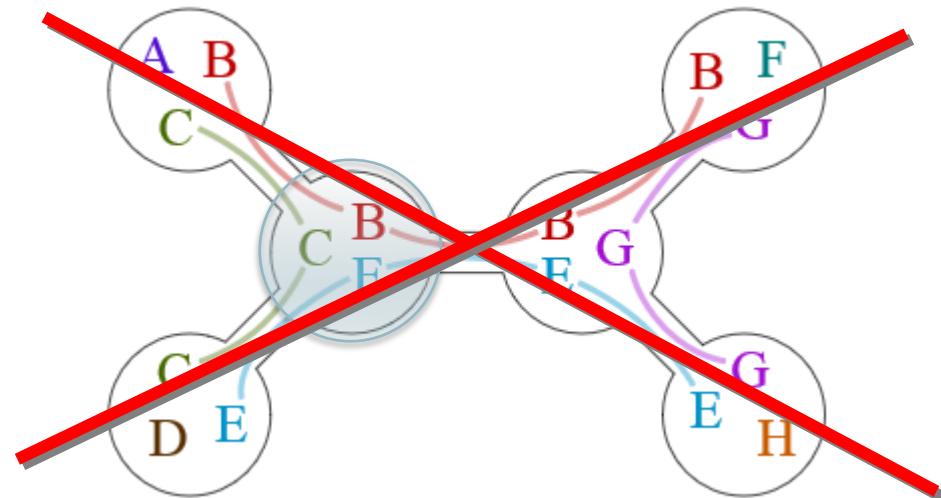


Representing search strategies

Graph G



Tree T encoding strategy for 3 cops



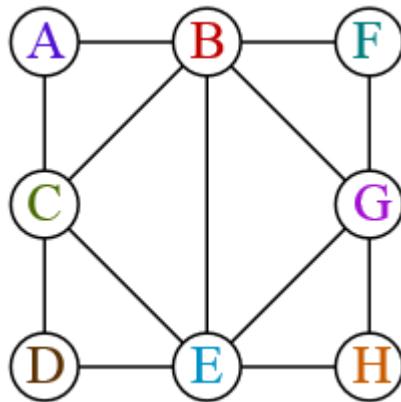
Each node $v \in V(T)$ gives cop-occupied positions in state v

Observation. Search strategy to catch an invisible robber is linear.

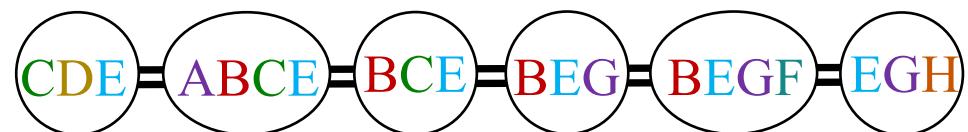
3. Change cop state as indicated by tree neighbor towards x

Path decompositions

Graph G



Path decomposition (T, X)



A **path decomposition** of G is a pair (T, X) where T is a **path** and X assigns a **bag** $X(w) \subseteq V(G)$ to each $w \in V(T)$, such that:

- A. $\forall uv \in E(G)$, some bag $X(w)$ contains both u and v
- B. $\forall v \in V(G)$, bags containing v form **connected** subtree of T

Pathwidth

The **width** of a path decomposition is the maximum bag size – 1

The **pathwidth** of G is the min. width of its path decompositions

Theorem. Graph G has pathwidth at most $k - 1$

\Leftrightarrow

k cops are sufficient to catch any invisible robber on G .

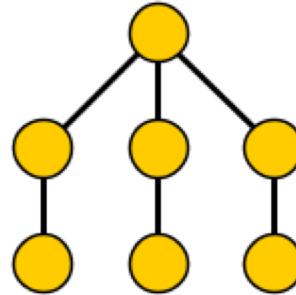
A **path decomposition** of G is a pair (T, X) where T is a **path** and X assigns a **bag** $X(w) \subseteq V(G)$ to each $w \in V(T)$, such that:

- A. $\forall uv \in E(G)$, some bag $X(w)$ contains both u and v
- B. $\forall v \in V(G)$, bags containing v form **connected** subtree of T

Catching robbers on trees

On a tree, a **visible** robber can be always caught by 2 cops

What about **invisible** robbers?



Invisible robber knowing the 2-cop strategy remains uncaught!

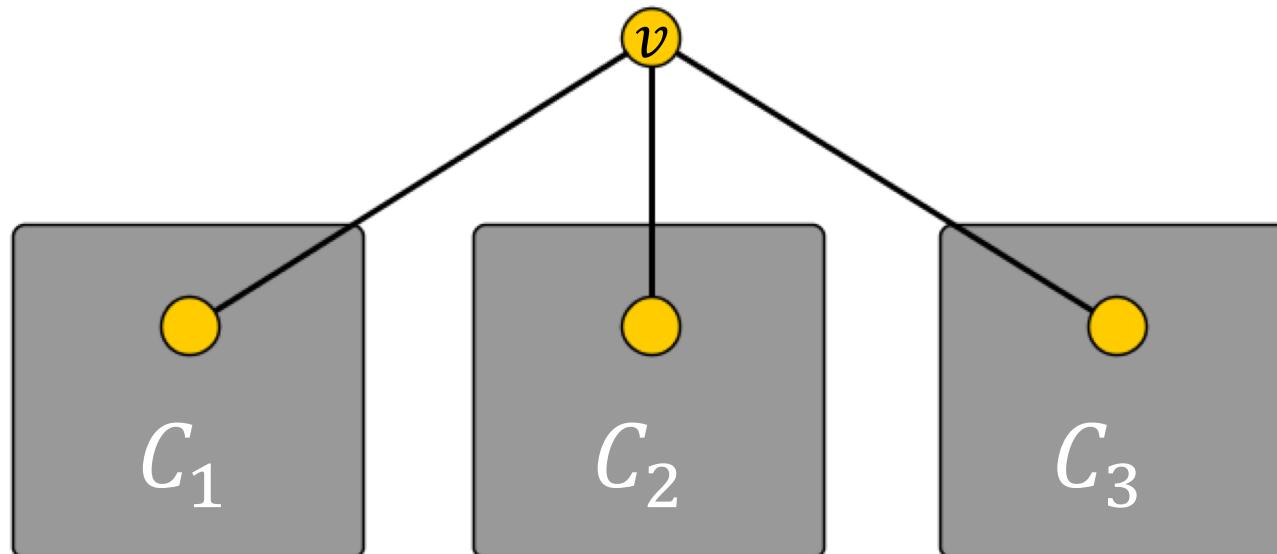
Simple lower bound for bag size of a path decomposition

Hiding places for invisible robbers

If $\text{pathwidth}(C_i) = k$ for $i \in \{1,2,3\}$

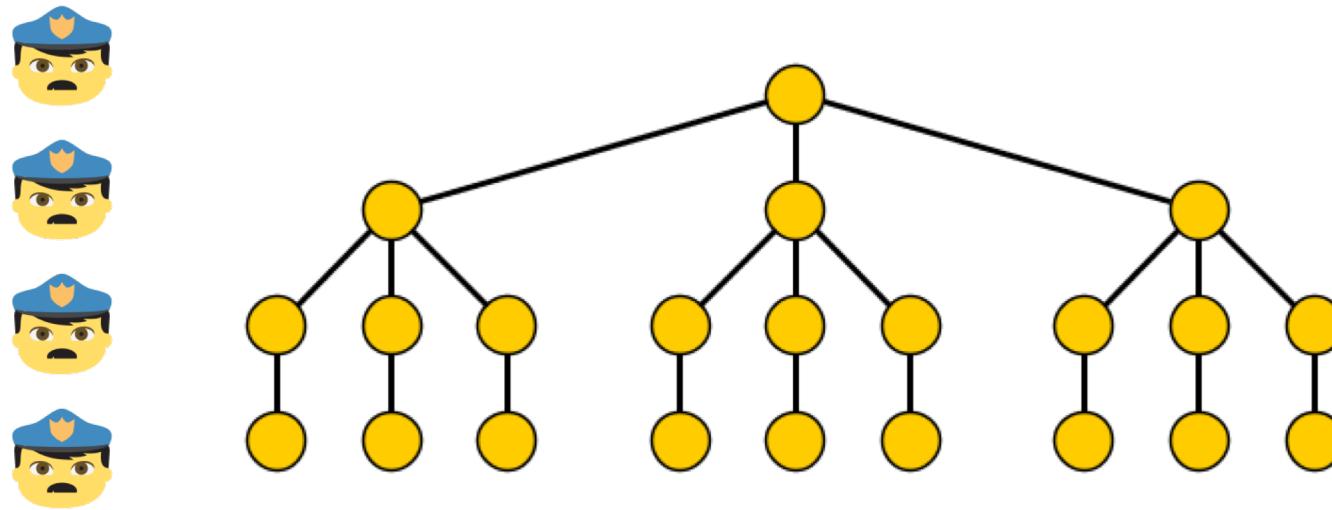
... then $\text{pathwidth}(C_1 \cup C_2 \cup C_3 \cup \{v\}) = k + 1$

when v is connected to 1 vertex in each C_i



Analogous lower bound for bag size of a path decomposition

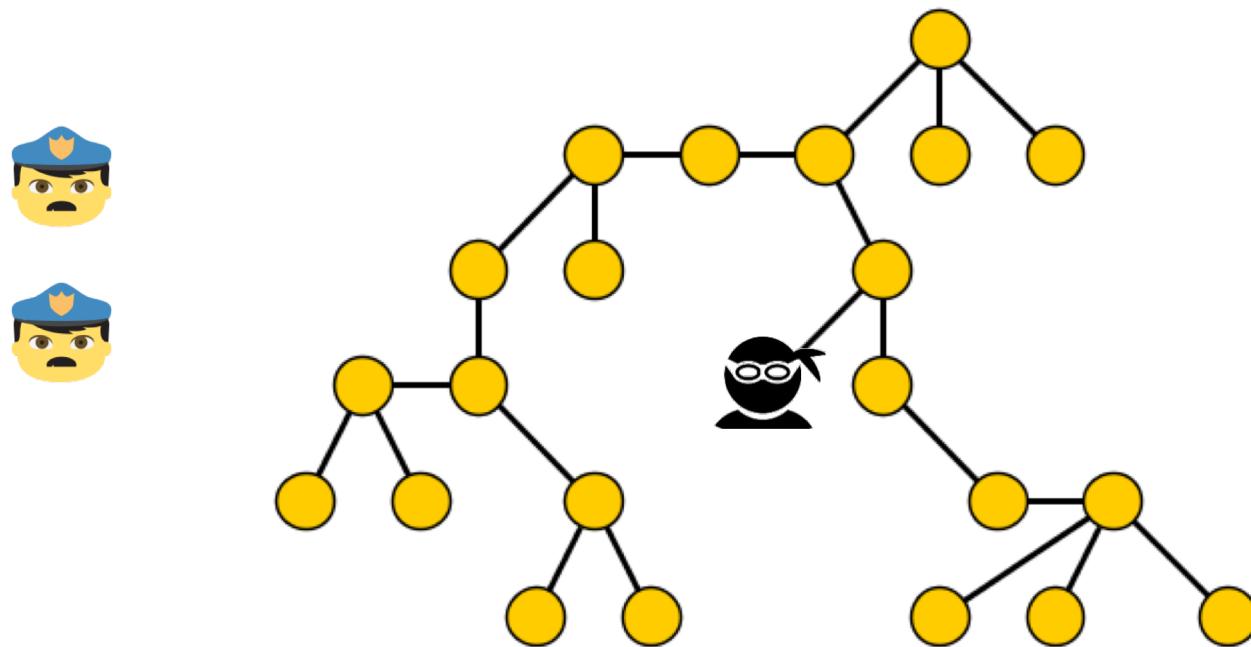
Acyclic hiding places for invisible robbers



Fact. A complete n -vertex ternary tree has pathwidth $\Omega(\log n)$.

Hunting invisible robbers on trees

Fact. In an n -vertex tree, $1 + \log n$ cops catch any invisible robber.



Relation between pathwidth and treewidth

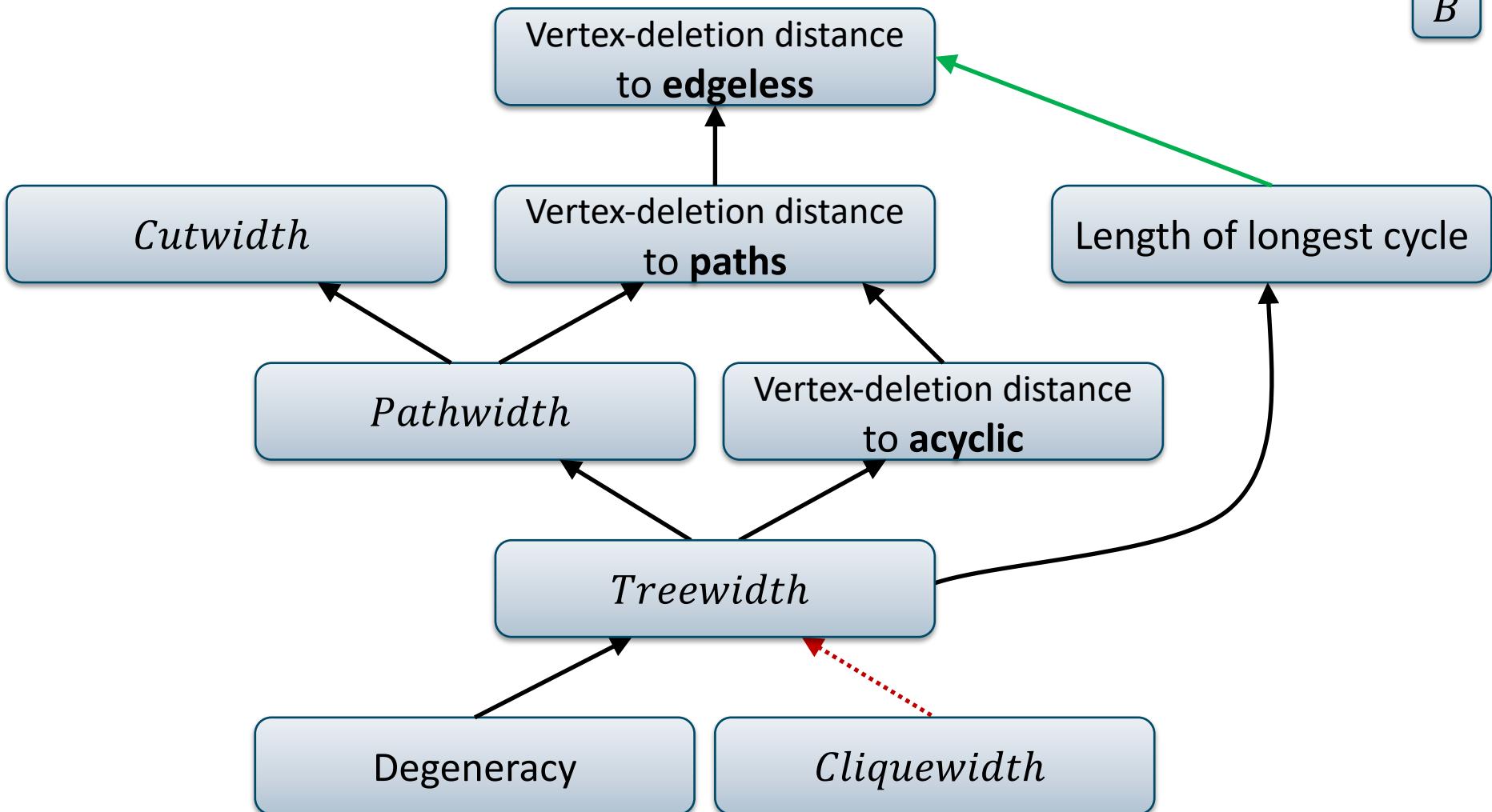
Theorem. For any graph G with n vertices:
 $\text{pathwidth}(G) \in O(\text{treewidth}(G) \cdot \log n)$.



Lemma. If the n -vertex graph G has treewidth k ,
then there is a **separator** $S \subseteq V(G)$ of size $k + 1$ such that
each connected component of $G - S$ has at most $\frac{n}{2}$ vertices.

A hierarchy of graph parameters

$$A \uparrow$$
$$B \uparrow$$
$$B(G) \leq A(G) + 1$$



Treewidth is bounded by circumference

Lemma. If the longest (simple) cycle in G has length k ,
then $\text{treewidth}(G) \leq k - 1$.

Proof idea:

- Start from a depth-first search tree in G
- Build a strategy for k cops to catch the robber

The graph minors project

INTERMEZZO

The Graph Minors project

- Series of 20 papers spanning 500+ pages
- Developed from 1983 – 2000
- Resulted in concepts of treewidth, pathwidth, brambles, etc.



Graph minor theorem. Undirected graphs are well-quasi-ordered by the minor relation.

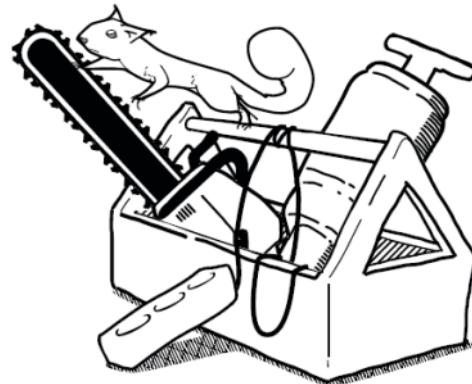
In any infinite sequence of graphs G_1, G_2, \dots there are $i < j$ with $G_i \leq_m G_j$.



Neil Robertson



Paul Seymour



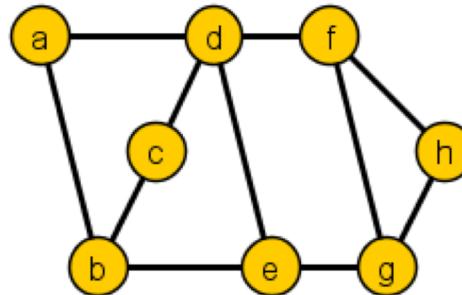
PARAMETERS BASED ON LINEAR STRUCTURE

Graphs with a linear structure

Pathwidth is a measure of the linear structure of a graph

Several **other** graph parameters are based on linear structure

Cutwidth, bandwidth, topological bandwidth ...

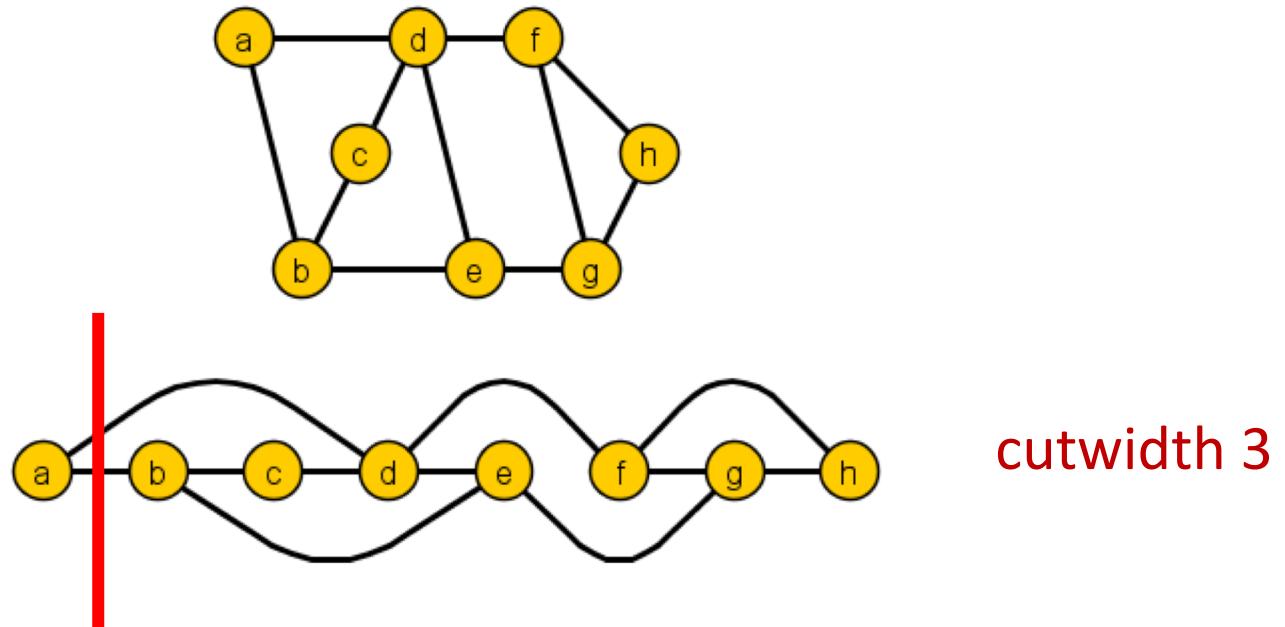


Graphs with a linear structure: cutwidth

The **cutwidth** of a linear ordering of $V(G)$ is:

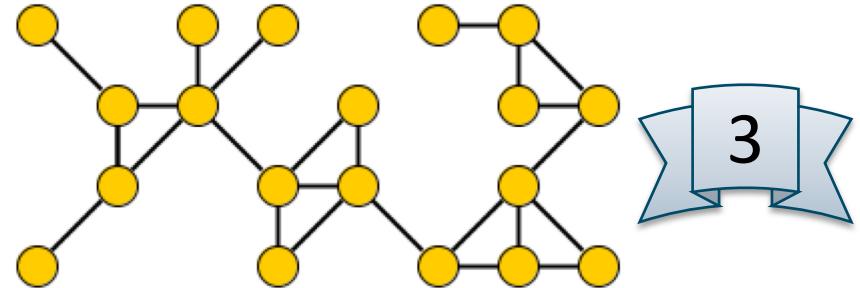
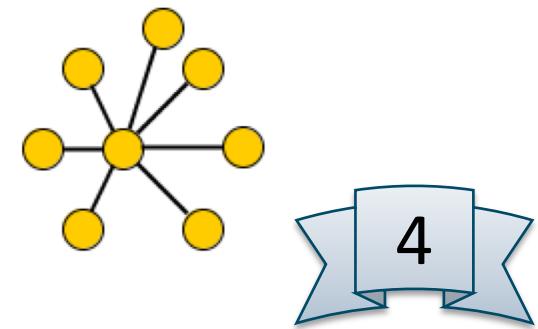
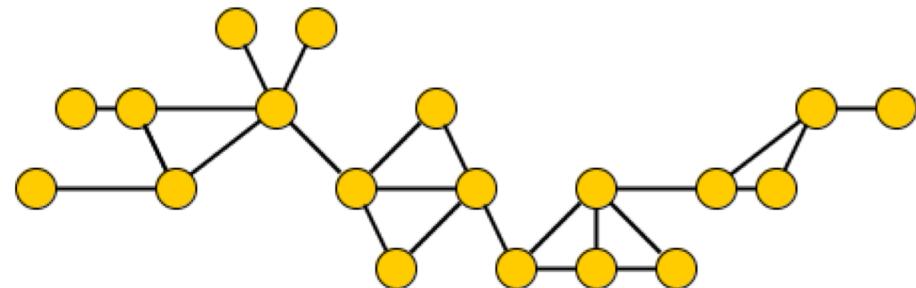
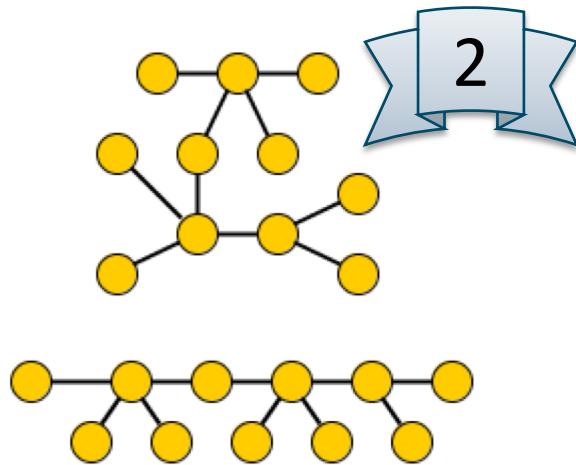
max. # edges intersected by a vertical line between vertices

The cutwidth of a graph is min. cutwidth of any ordering of $V(G)$



Cutwidth of some simple graphs

Cutwidth



Properties of cutwidth

Lemma. For any graph G : $\text{pathwidth}(G) \leq \text{cutwidth}(G)$.

Fact. For the star $K_{1,n}$ with n leaves: $\text{cutwidth}(K_{1,n}) = \left\lceil \frac{n-1}{2} \right\rceil$.

Fact. For the complete graph K_n : $\text{cutwidth}(K_n) = \left\lfloor \frac{n}{2} \right\rfloor \cdot \left\lceil \frac{n}{2} \right\rceil$.



And now, by popular request ...

MENTIMETER

BEYOND TREewidth

What if treewidth is too large?

Among all n -vertex graphs, the clique K_n is least treelike
 K_n is the unique n -vertex graph of treewidth $n - 1$

What about applications where a clique is a ‘simple’ graph?

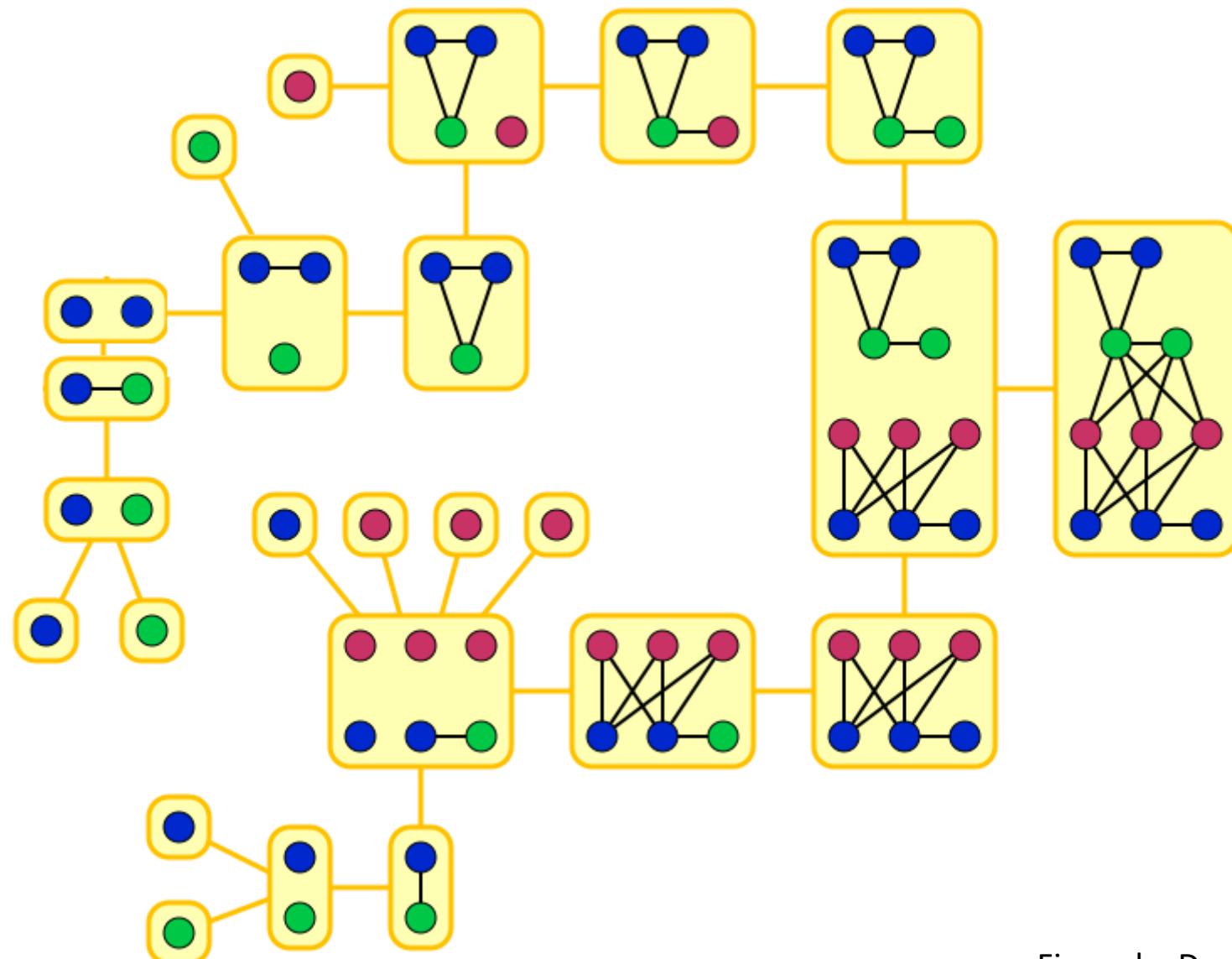
- Graph parameter that gives small values on trees and cliques?
- Should not be monotone when taking subgraphs

Cliquewidth

The **cliquewidth** of G is the minimum number of labels to construct it using the following operations in a tree-like fashion:

1. Create new vertex with label i
2. Disjoint union of two graphs G and H
3. Joining each i -labeled vertex to each j -labeled vertex ($i \neq j$)
4. Renaming label i to label j

Constructing a graph of cliquewidth 3



Cliquewidth

The **cliquewidth** of G is the minimum number of labels to construct it using the following operations in a tree-like fashion:

1. Create new vertex with label i
2. Disjoint union of two graphs G and H
3. Joining each i -labeled vertex to each j -labeled vertex ($i \neq j$)
4. Renaming label i to label j

$$\text{cliquewidth}(K_n) = 2 \quad \text{treewidth}(K_n) = n - 1$$

EXERCISES ON TREewidth

Small-treewidth graphs have a low-degree vertex

Lemma. If G has treewidth k ,
then G has a vertex of degree at most k .

Proof strategies:

1. If $k + 1$ cops can catch any robber on G , it has a deg- k vertex
2. Find a degree- k vertex by inspecting leaves of decomposition

Corollary.

An n -vertex graph of treewidth k has at most nk edges.

Cliques are represented in tree decompositions

Lemma. If $S \subseteq V(G)$ forms a clique in G , then any tree decomposition for G has a bag containing all vertices of S .



Helly property. If T is a tree and T_1, \dots, T_k are connected subgraphs of T such that $V(T_i) \cap V(T_j) \neq \emptyset$ for all $1 \leq i, j \leq k$, then $V(T_1) \cap V(T_2) \cap \dots \cap V(T_k) \neq \emptyset$.

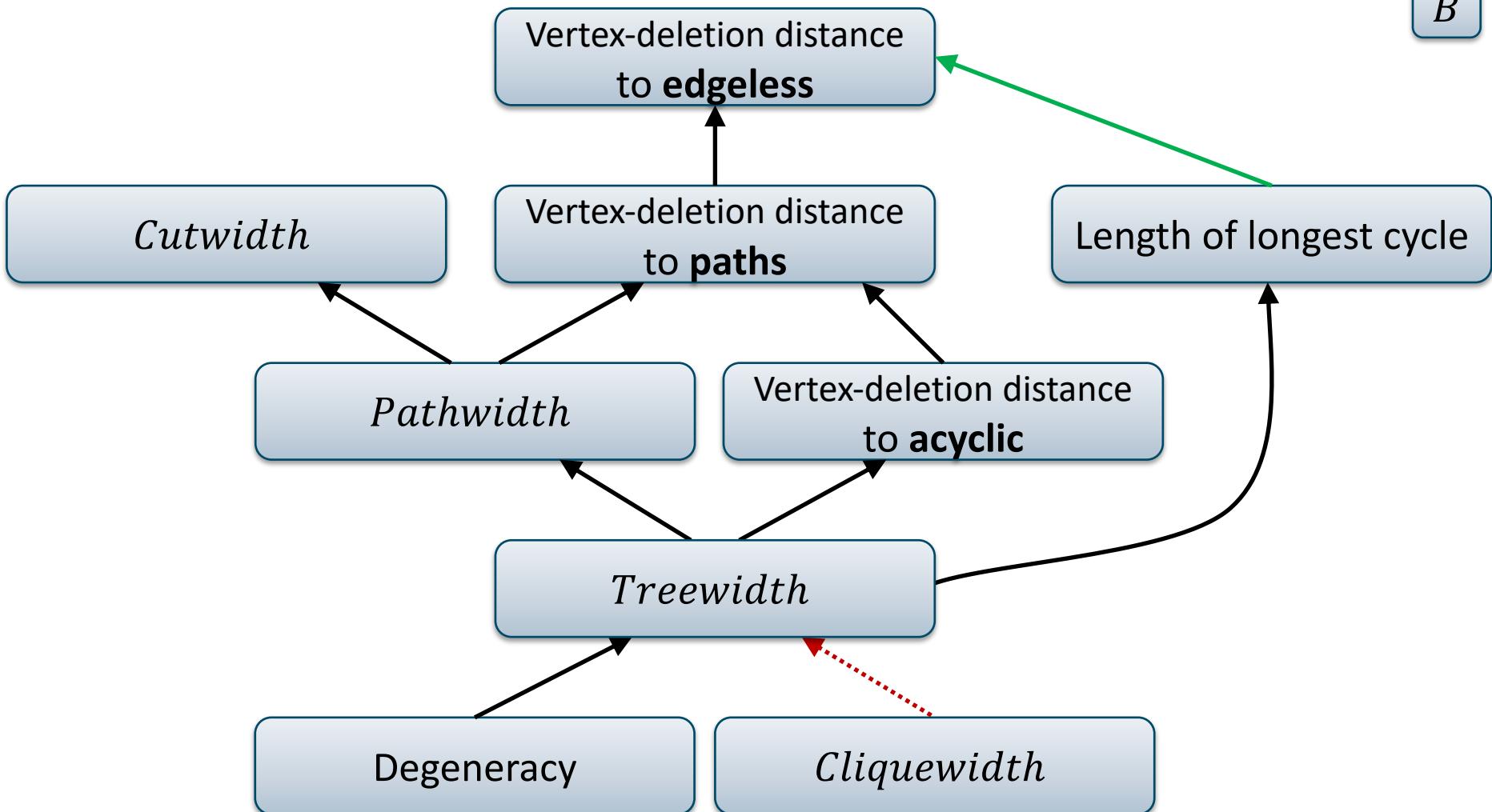
Corollary.

If G has a clique of size k , then $\text{treewidth}(G) \geq k - 1$.

CLOSING REMARKS

A hierarchy of graph parameters

$$A \uparrow$$
$$B \uparrow$$
$$B(G) \leq A(G) + 1$$



Summary

Various sets of rules for cops-and-robber games yield:

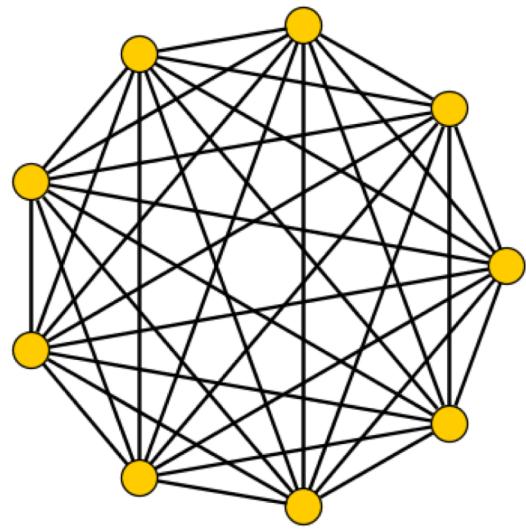
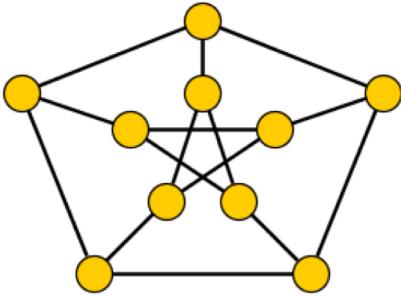
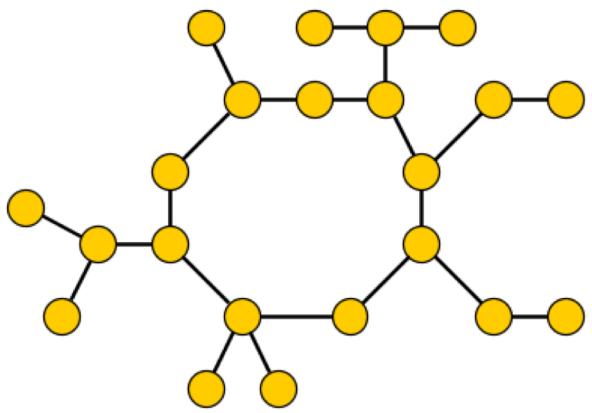
- Different graph parameters
- Associated graph decompositions representing strategies

Hierarchy of parameters suggests a [research methodology](#)

- Tackle problem for small values of restrictive parameter
- Then generalize to more robust parameters

Applications on [Thursday](#)

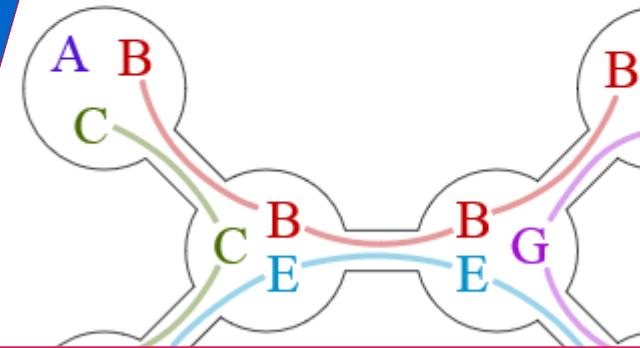
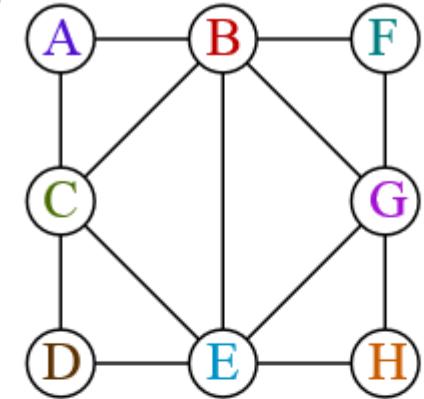




Structural graph parameters

PART 3: APPLICATIONS

Bart M. P. Jansen (edited by mjd – 2021)



Plan for today

Tackling a party planning
problem

Algorithms on tree
decompositions

ALGORITHMS EXPLOITING GRAPH STRUCTURE

Algorithms using tree structure

Many problems that are NP-complete **in general**,
can be solved efficiently on graphs of **bounded treewidth**

INDEPENDENT SET, DOMINATING SET, 3-COLORING,
HAMILTONIAN CYCLE, CLIQUE, FEEDBACK VERTEX SET,
DISJOINT PATHS, PARTITION INTO TRIANGLES, ...

Tree-like structure can be exploited by **dynamic programming**

Two-step presentation:

1. Dynamic programming on trees
2. Dynamic programming on tree decompositions

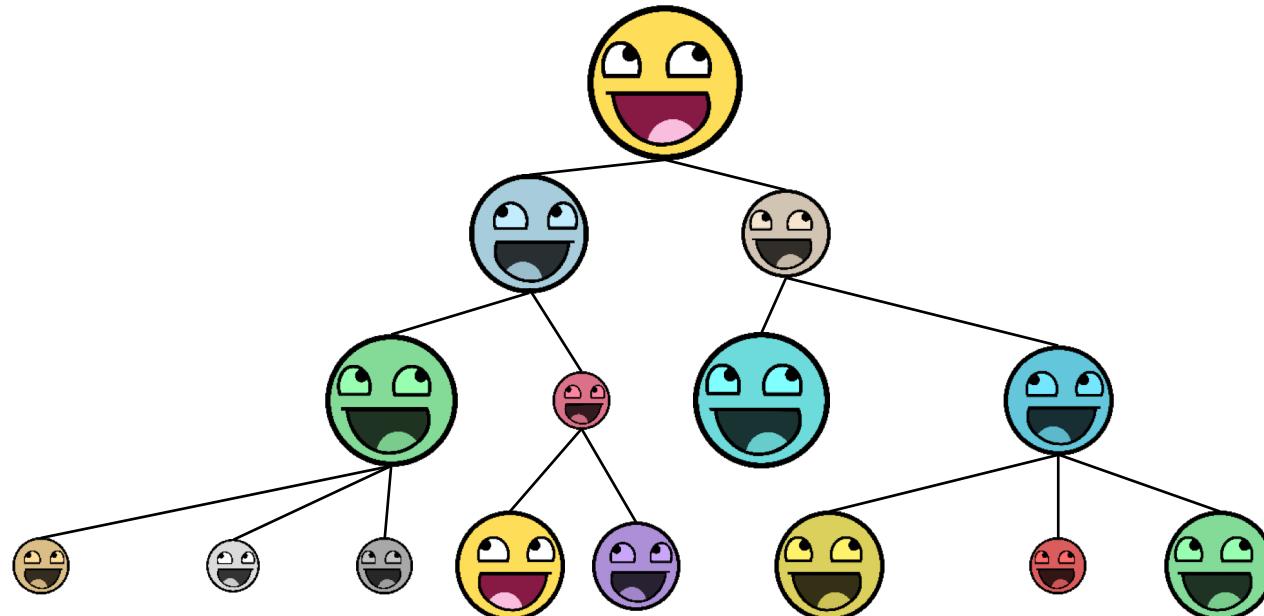
The party problem

We are planning a party in a hierarchical company

Each employee has a fun factor that they would contribute

Goal: invite people that maximize the total fun factor

Constraint: a party is no fun when your direct boss is present



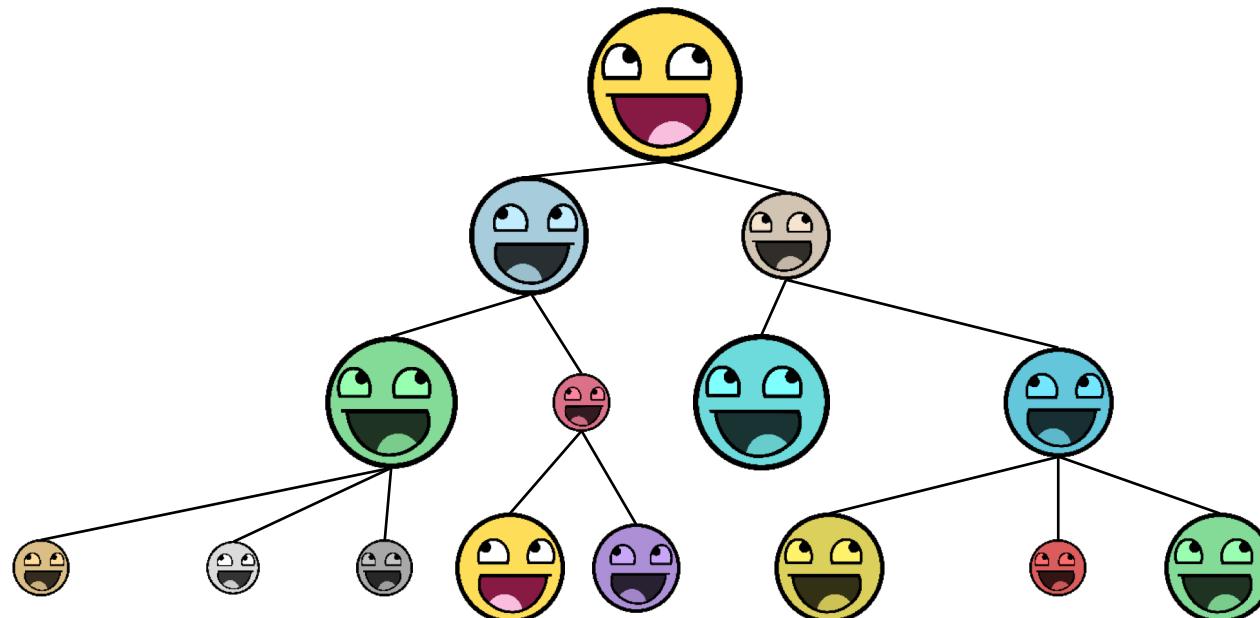
The party crowd forms an independent set

Input: A tree T with a weight $w(v)$ for each $v \in V(T)$

Task: Find **independent set** $S \subseteq V(T)$ maximizing $\sum_{v \in S} w(v)$

Easy if all weights are equal – weights make it interesting

Focus on computing the *value* of an optimal solution

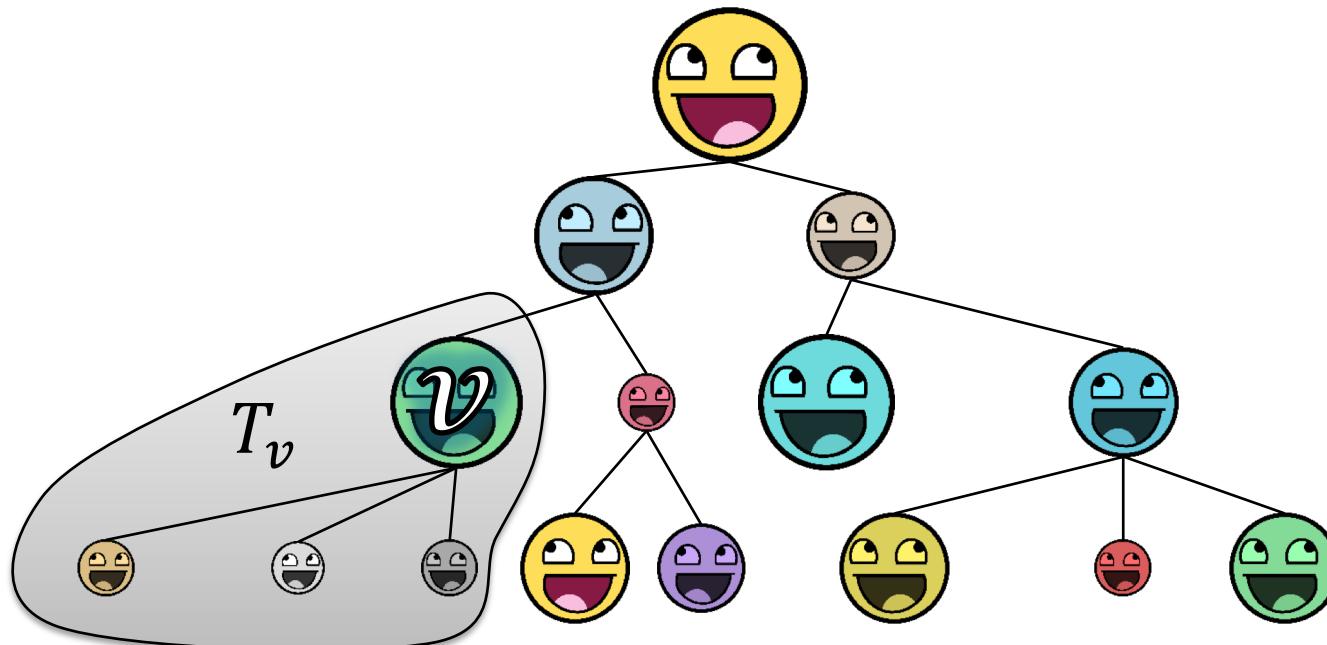


Solving the party problem

Input: A tree T with a weight $w(v)$ for each $v \in V(T)$

Task: Find **independent set** $S \subseteq V(T)$ maximizing $\sum_{v \in S} w(v)$

For $v \in V(T)$, let T_v denote the subtree rooted at v



Subproblems for subtrees

$A[v] :=$ maximum weight of ind. set in T_v **that contains v**

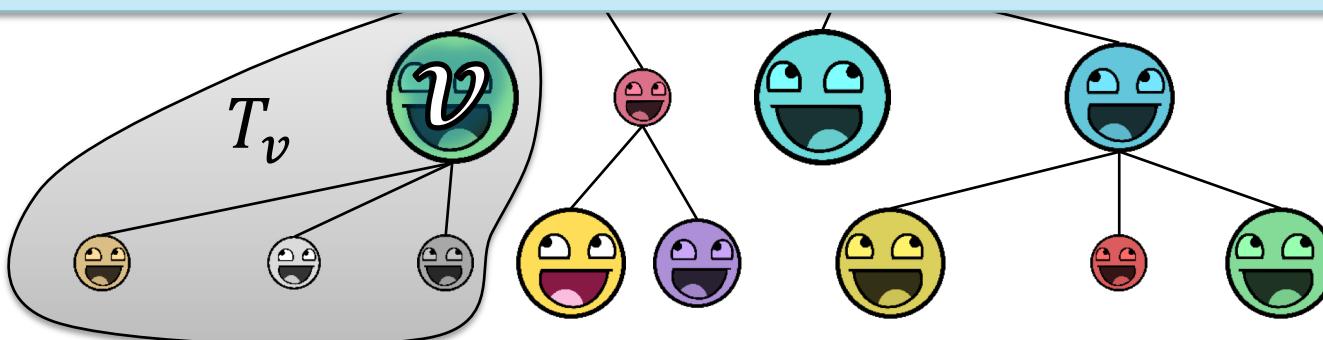
$B[v] :=$ maximum weight of ind. set in T_v **not containing v**

For $v \in V(T)$, let T_v denote the subtree rooted at v



Observation.

If r is the root of T , then the maximum weight of an independent set in the entire tree is $\max(A[r], B[r])$



An expression using child values

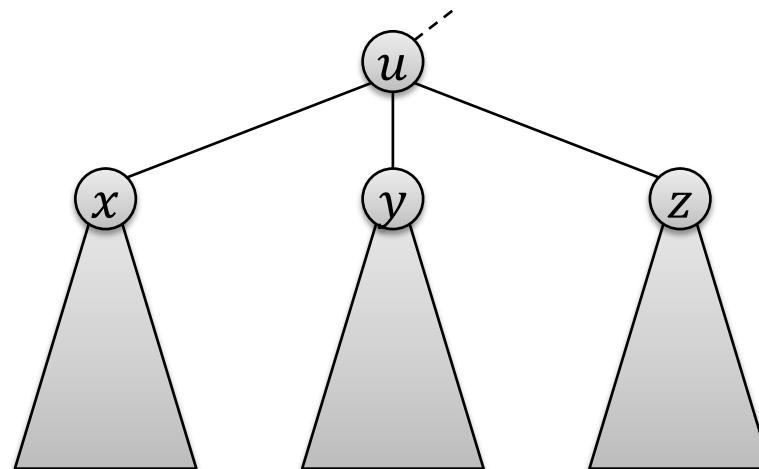
$A[v] :=$ maximum weight of ind. set in T_v **that contains v**

$B[v] :=$ maximum weight of ind. set in T_v **not containing v**

If vertex u has children x, y, z :

$$A[u] = w(u) + B[x] + B[y] + B[z]$$

$$B[u] = \max(A[x], B[x]) + \max(A[y], B[y]) + \max(A[z], B[z])$$



General recurrence

$A[v] :=$ maximum weight of ind. set in T_v **that contains v**

$B[v] :=$ maximum weight of ind. set in T_v **not containing v**

If $C(u)$ are the children of u :

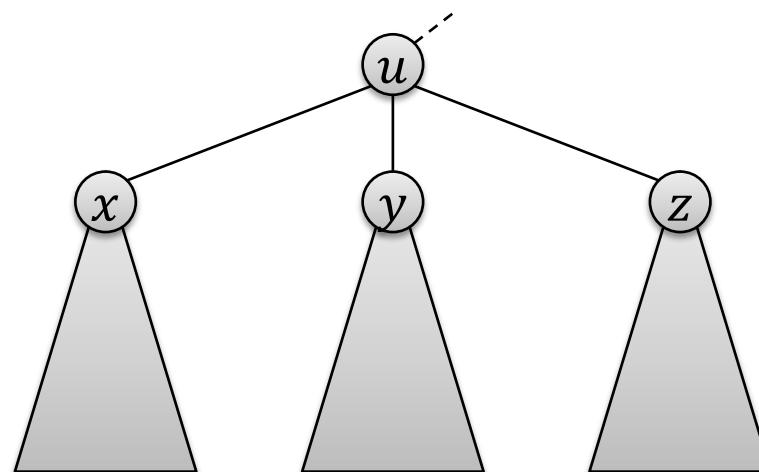
$$A[u] = w(u) + \sum_{x \in C(u)} B[x]$$

$$B[u] = \sum_{x \in C(u)} \max(A[x], B[x])$$

If u is a leaf:

$$A[u] = w(u)$$

$$B[u] = 0$$



Solving the party problem using the recurrence

Compute the values of $A[u]$ and $B[u]$ bottom-up in the tree

Theorem. An independent set of maximum weight in an n -vertex tree can be found in $O(n)$ time.

Which properties of trees did we exploit?

- The rooted tree decomposes the input into subproblems
- Only two possible states per subproblem ($u \in S, u \notin S$)
- Easy to answer subproblems for v using values for $C(v)$

General algorithm for INDEPENDENT SET

Theorem. An independent set of maximum weight in an n -vertex tree can be found in $O(n)$ time.

Algorithm is very efficient, but only works in trees

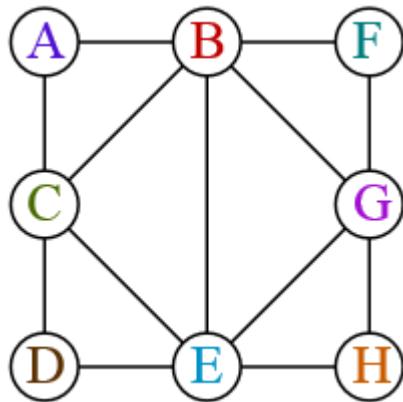
Goal: Adapt it to work efficiently for **treelike** graphs



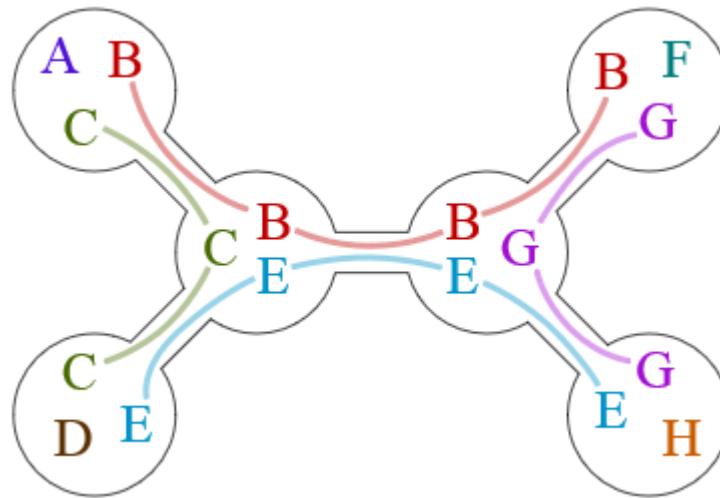
time $O(2^w \cdot n)$ for treewidth w

Tree decompositions

Graph G



Tree decomposition (T, X)

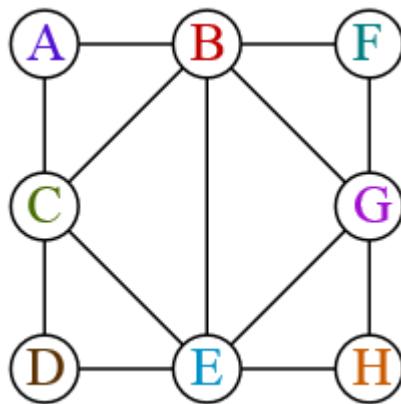


A **tree decomposition** of G is a pair (T, X) where T is a tree and X assigns a **bag** $X(w) \subseteq V(G)$ to each $w \in V(T)$, such that:

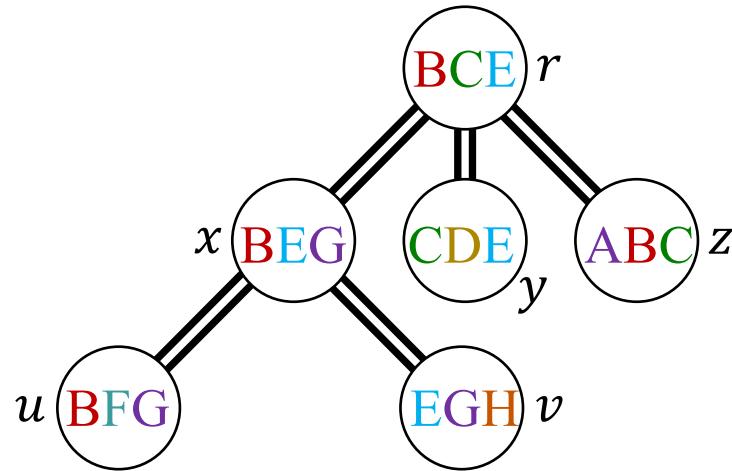
- $\forall uv \in E(G)$, some bag $X(w)$ contains both u and v
- $\forall v \in V(G)$, bags $X^{-1}(v)$ containing v form **connected** subtree of T

Rooted tree decompositions

Graph G



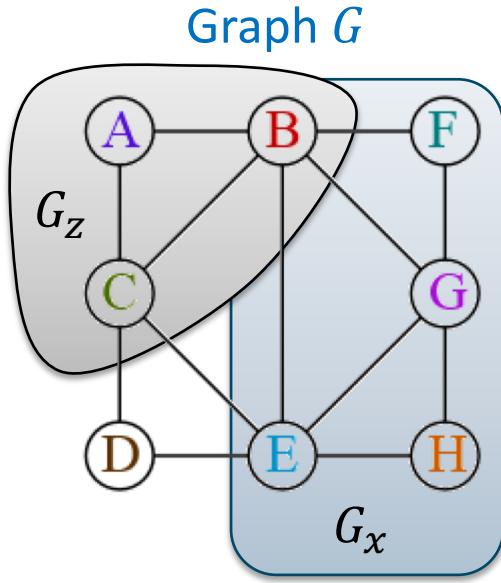
Rooted tree decomposition (T, X)



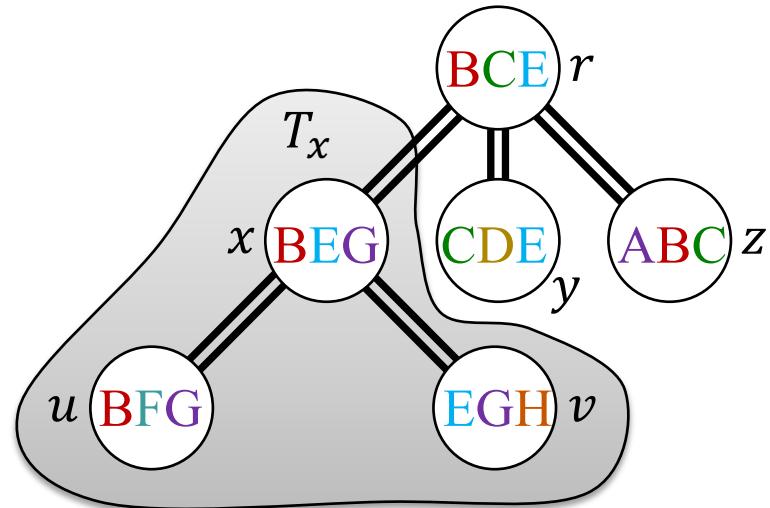
A **tree decomposition** of G is a pair (T, X) where T is a **rooted** tree and X assigns a **bag** $X(w) \subseteq V(G)$ to each $w \in V(T)$, such that:

- $\forall uv \in E(G)$, some bag $X(w)$ contains both u and v
- $\forall v \in V(G)$, bags $X^{-1}(v)$ containing v form **connected** subtree of T

The tree decomposes the graph



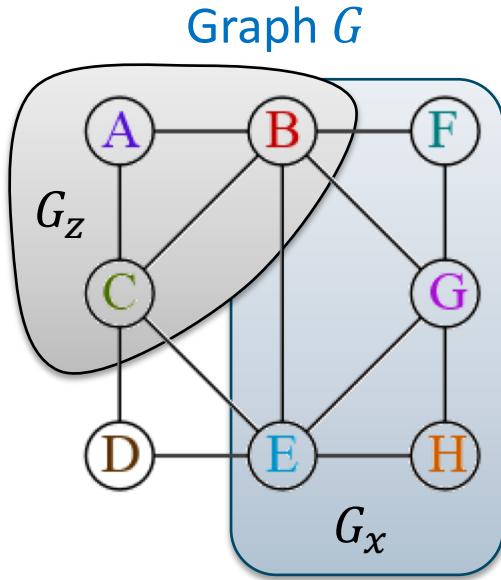
Rooted tree decomposition (T, X)



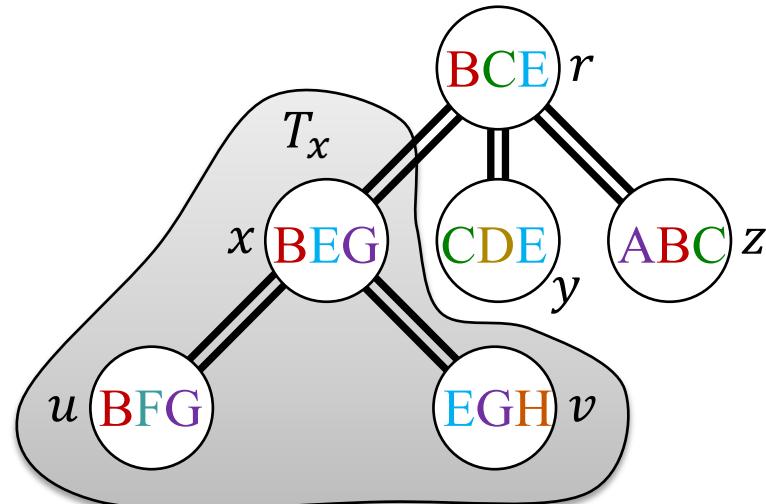
For $v \in V(T)$, let:

- T_v denote the subtree rooted at v
- $X(T_v) := \bigcup_{u \in V(T_v)} X(u)$ be vertices of G in bags of T_v
- G_v be the subgraph of G induced by vertices $X(T_v)$

The tree decomposes the graph



Rooted tree decomposition (T, X)



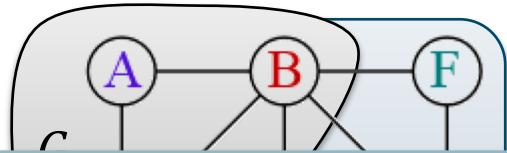
Claim. For any node $x \in V(T)$, each vertex of G_x that has a neighbor outside G_x , belongs to the bag $X(x)$.

- A. $\forall uv \in E(G)$, some bag $X(w)$ contains both u and v
- B. $\forall v \in V(G)$, bags $X^{-1}(v)$ containing v form **connected** subtree of T

Vertices in $X(T_v)$ only communicate with the outside through $X(v)$

Subproblems for nodes of the decomposition

Graph G

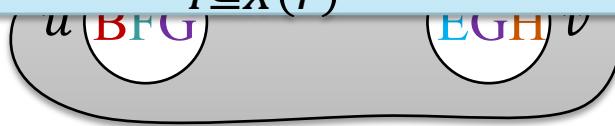


Rooted tree decomposition (T, X)



Observation.

If r is the root of T , then the maximum weight of an independent set in the entire graph is $\max_{I \subseteq X(r)} M[r, I]$



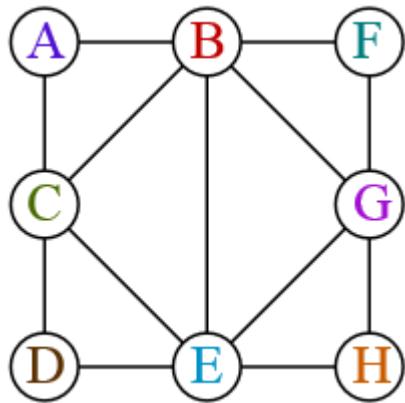
For $v \in V(T)$ and $I \subseteq X(v)$, define:

$M[v, I] :=$ the maximum weight of an independent set S in G_v
that satisfies $S \cap X(v) = I$

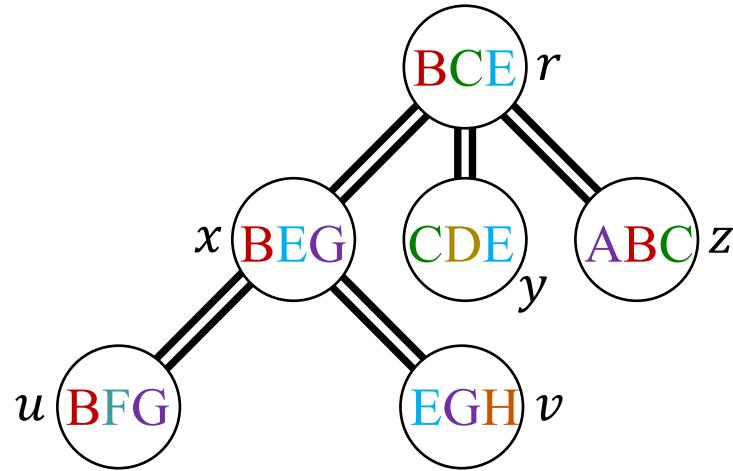
$M[v, I] := -\infty$ if I is not an independent set

Nice tree decompositions

Graph G



Rooted tree decomposition (T, X)

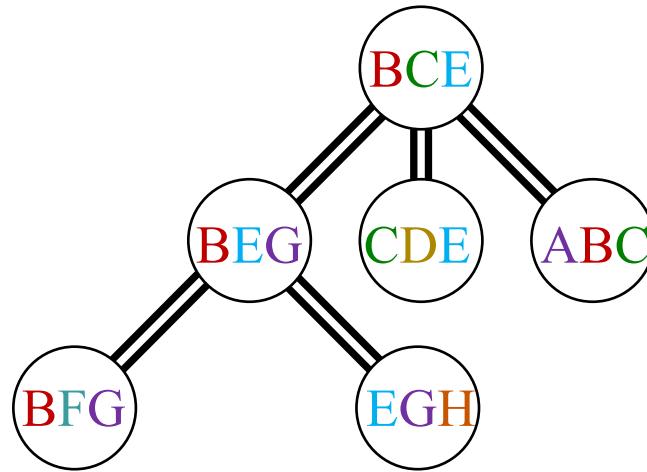
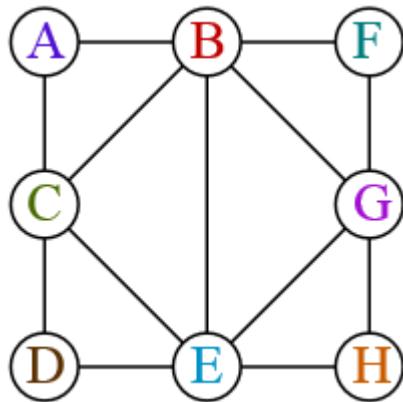


Easier to develop a recurrence for $M[\cdot, \cdot]$ values if (T, X) is nice:

1. Nodes have at most 2 children

Making a tree decomposition nice

Graph G

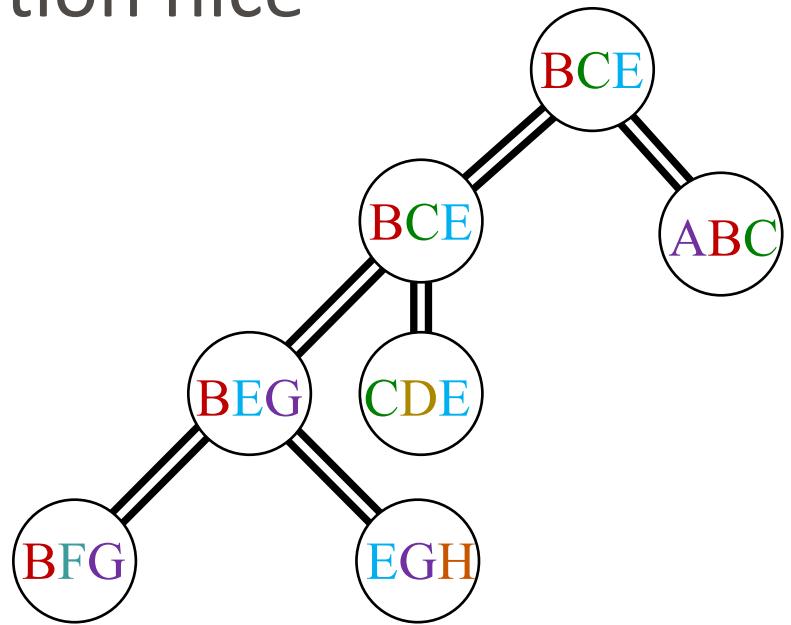
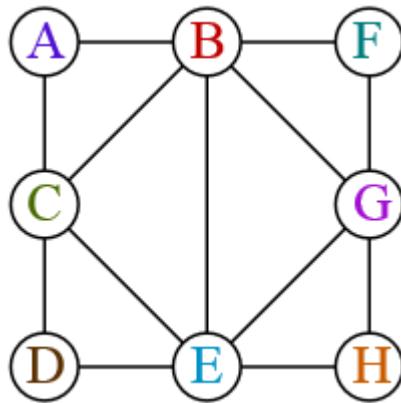


Easier to develop a recurrence for $M[\cdot, \cdot]$ values if (T, X) is **nice**:

1. Nodes have at most **2 children**

Making a tree decomposition nice

Graph G

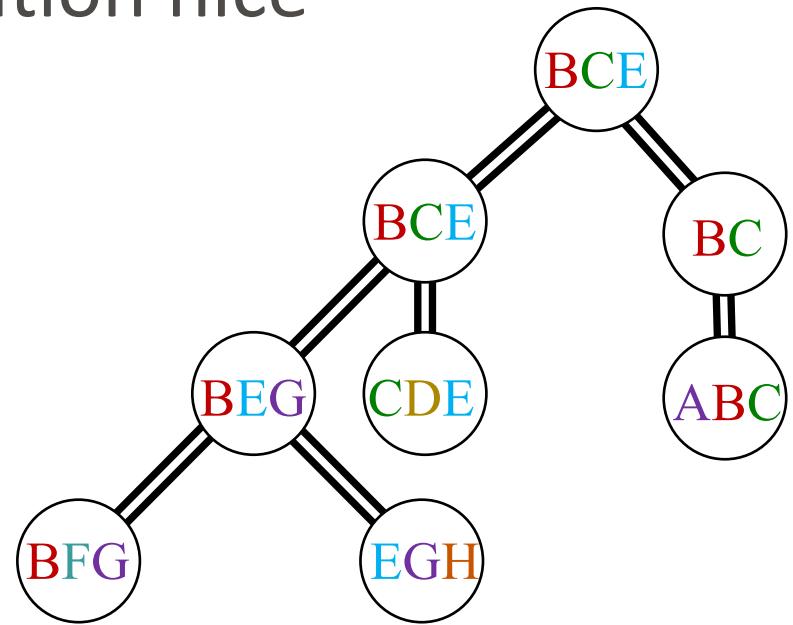
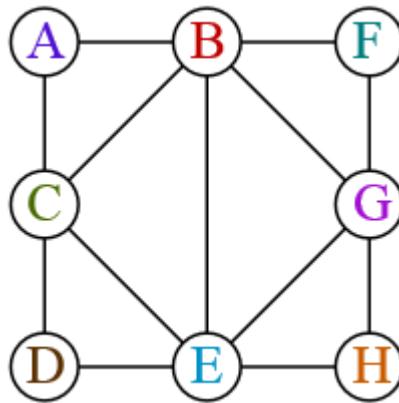


Easier to develop a recurrence for $M[\cdot, \cdot]$ values if (T, X) is **nice**:

1. Nodes have at most **2 children**
2. If a node p has 1 child u , then $X(p)$ and $X(u)$ **differ by ≤ 1 vertex**

Making a tree decomposition nice

Graph G

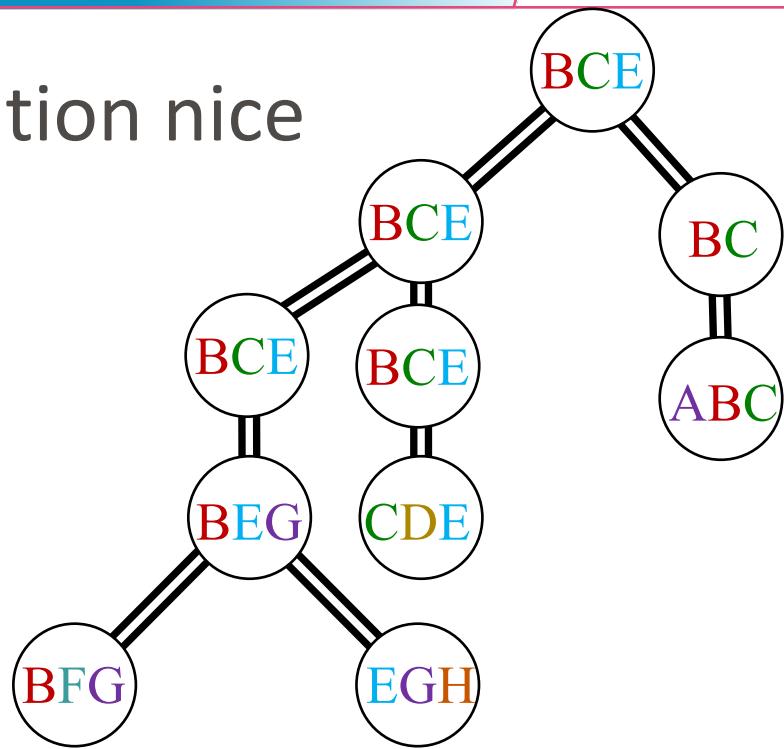
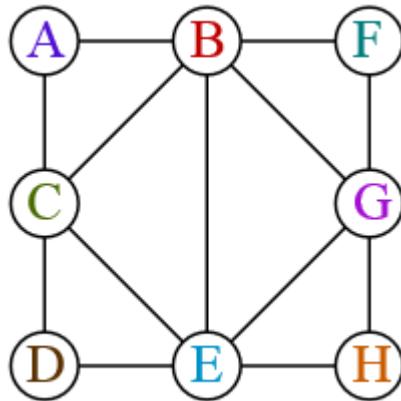


Easier to develop a recurrence for $M[\cdot, \cdot]$ values if (T, X) is **nice**:

1. Nodes have at most **2 children**
2. If a node p has 1 child u , then $X(p)$ and $X(u)$ **differ by ≤ 1 vertex**
3. If a node p has 2 children u and v , then **$X(p) = X(u) = X(v)$**

Making a tree decomposition nice

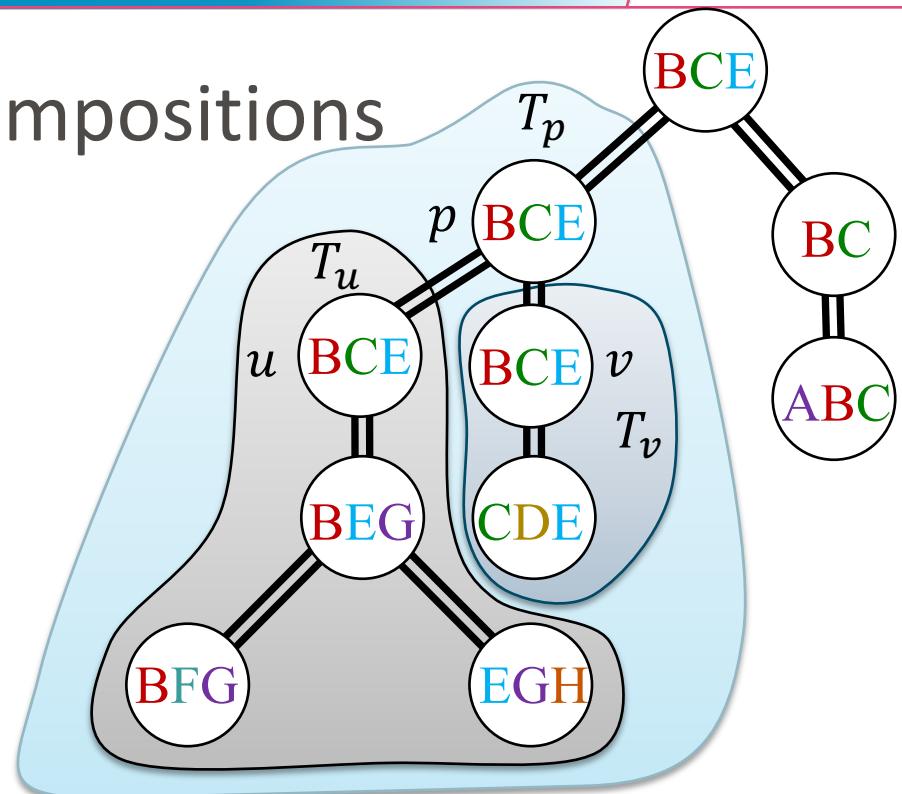
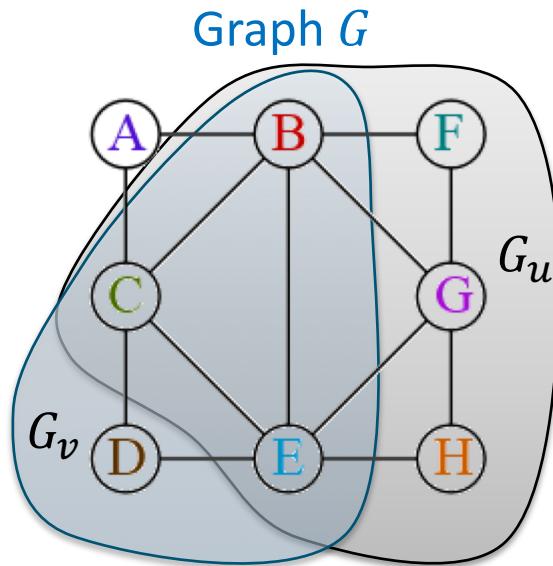
Graph G



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Structure of nice decompositions



If node p has children u and v with $X(p) = X(u) = X(v)$:

Let S_u be an independent set in G_u , and

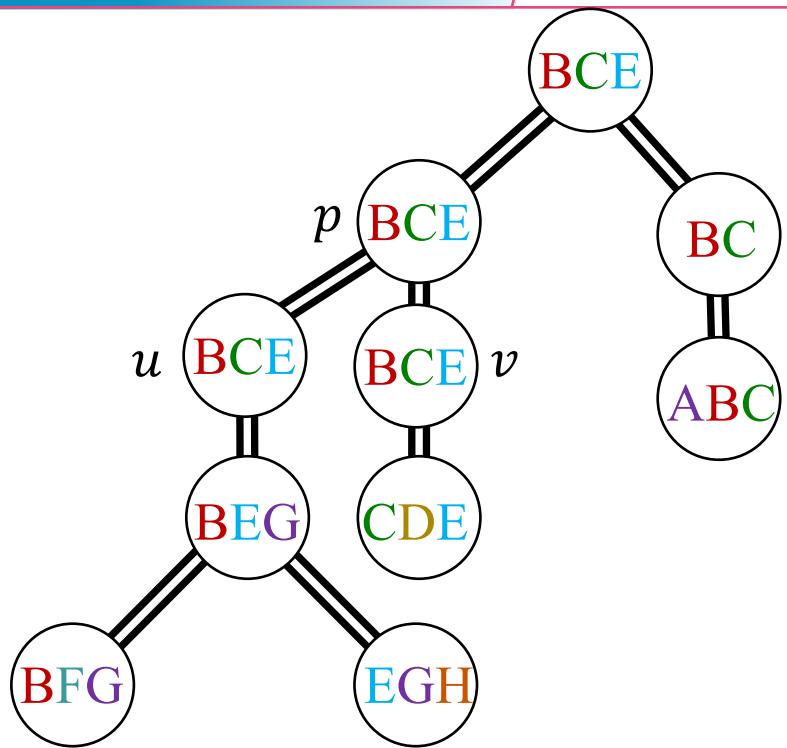
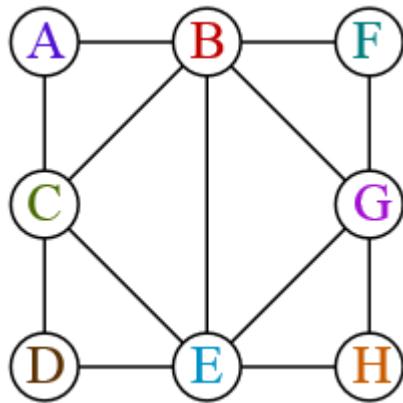
S_v be an independent set in G_v ,

such that $S_u \cap X(p) = S_v \cap X(p) = I$.

Then $S_u \cup S_v$ is an independent set in G_p of weight $w(S_u) + w(S_v) - w(I)$.

A recurrence for M

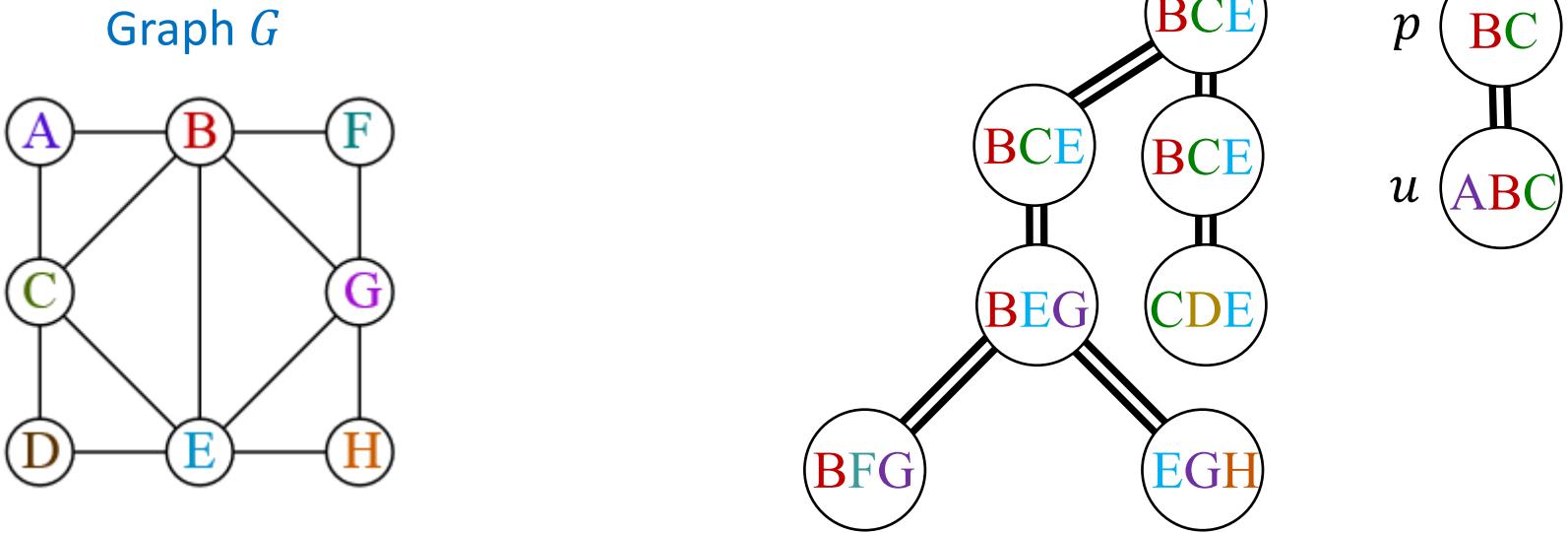
Graph G



If node p has children u and v with $X(p) = X(u) = X(v)$:

$$M[p, I] = M[u, I] + M[v, I] - \sum_{a \in I} w(a)$$

A recurrence for M

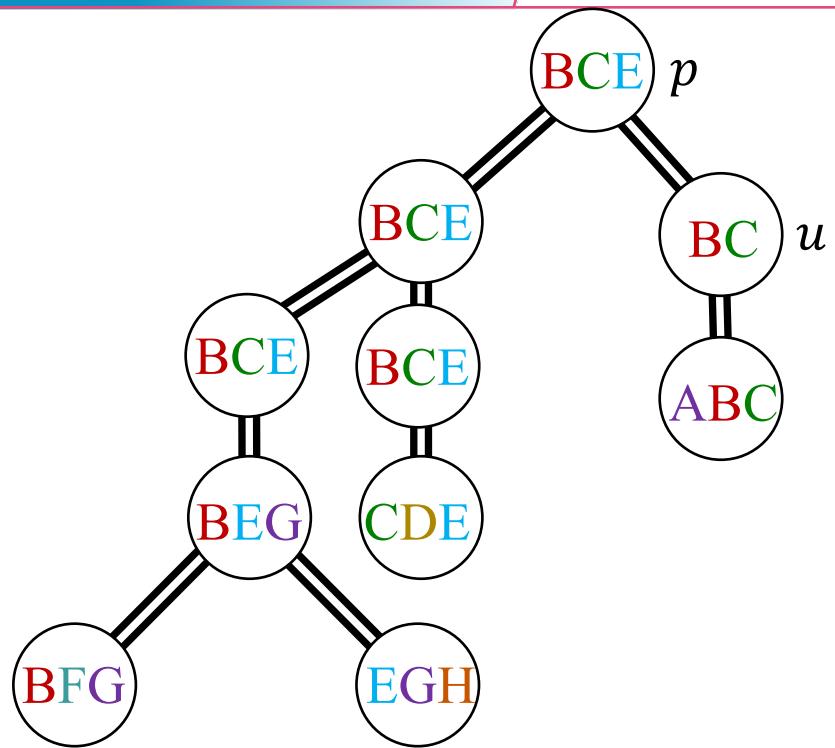
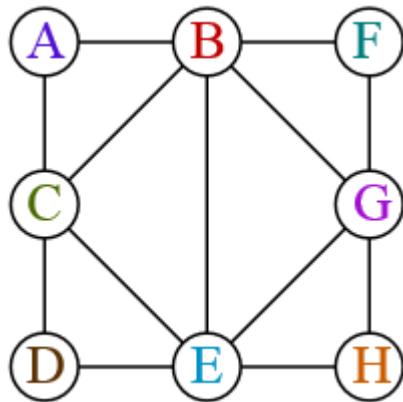


If node p has 1 child u with $X(p) = X(u) \setminus \{a\}$, then:

$$M[p, I] = \begin{cases} \max(M[u, I], M[u, I \cup \{a\}]) & \text{if } I \cup \{a\} \text{ is independent} \\ M[u, I] & \text{otherwise} \end{cases}$$

A recurrence for M

Graph G

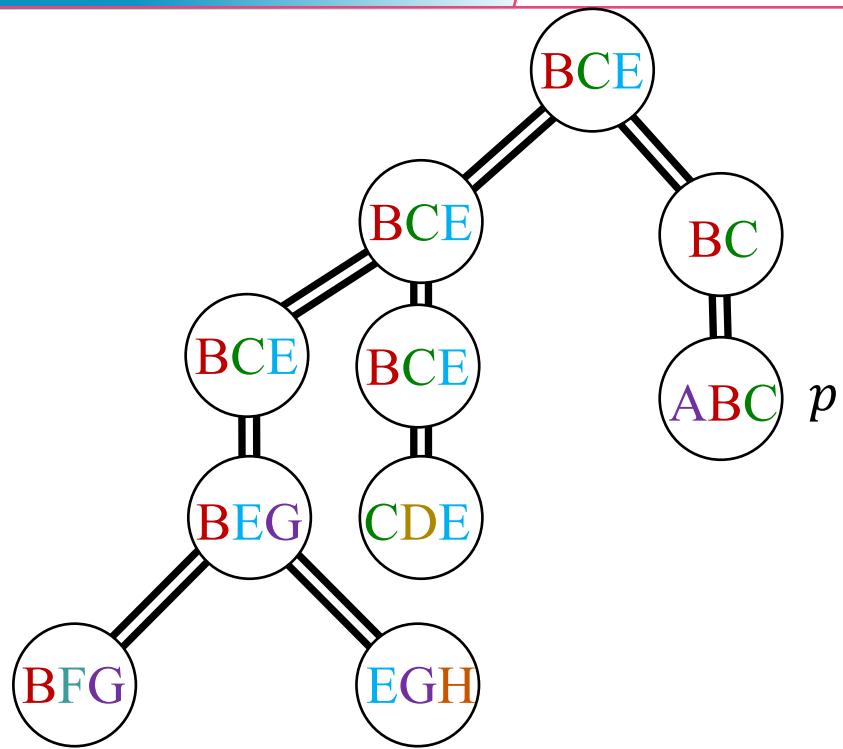
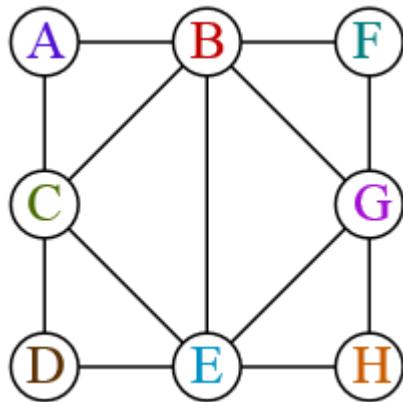


If node p has 1 child u with $X(p) = X(u) \cup \{a\}$, then:

$$M[p, I] = \begin{cases} w(a) + M[u, I \setminus \{a\}] & \text{if } a \in I \wedge I \text{ independent} \\ -\infty & \text{if } a \in I \wedge I \text{ not independent} \\ M[u, I] & \text{if } a \notin I \end{cases}$$

A recurrence for M

Graph G



If node p is a leaf:

$$M[p, I] = \begin{cases} \sum_{a \in I} w(a) & \text{if } I \text{ is independent} \\ -\infty & \text{if } I \text{ is not independent} \end{cases}$$

Solving INDEPENDENT SET using the recurrence

Compute the values of $M[\cdot, \cdot]$ bottom-up in the tree

- For each $u \in V(T)$ there are $2^{|X(u)|}$ subproblems $M[u, I]$
 - On a tree decomposition of width w , bag size is $\leq w + 1$
 - At most $|V(T)| \cdot 2^{w+1}$ subproblems in total
 - n -vertex graph has nice tree decomps with $O(n)$ nodes
- Using values for children, computation takes $O(1)$ steps
- Answer is given by $\max_{I \subseteq X(r)} M[r, I]$

Theorem. Given a width- w tree decomposition of an n -vertex graph G , a maximum weight independent set in G can be found in $O(2^w \cdot n)$ time.

Algorithms on bounded-treewidth graphs

Two-step approach:

1. Compute a small-width tree decomposition of the input
2. Solve the problem by bottom-up dynamic programming

Task (1) is not easy: TREewidth is **NP-complete**

- Solvable in $\mathcal{O}(n)$ for fixed target width w
- Heuristics exist & suboptimal dec's give optimal solutions

Task (2) is sometimes painful, but can be **automated**

A meta-theorem

Very general statement:

*problems that can be stated in a certain logic,
can be solved efficiently on graphs of bounded treewidth*

Stated in terms of Monadic Second Order logic

Boolean logic: no quantification over variables

$$(a \rightarrow (b \vee c)) \rightarrow (\neg a \vee (b \vee c))$$

First-order logic: quantify over **single objects**

$$\exists x: \text{human}(x) \wedge \text{mortal}(x)$$

Monadic second-order logic: can also quantify over **sets**

$$\exists S, \forall x: \text{human}(x) \rightarrow x \in S$$

Monadic second-order logic on graphs

MSO on graphs allows logic formulas consisting of:

- Logical connectives $\{\wedge, \vee, \rightarrow, \leftrightarrow, \neg\}$
- Quantification over objects and sets $\exists x, \forall x, \exists S, \forall S$
- $Vtx(x), Edge(e), Adj(x, y), Inc(x, e), =, \in$

Universe of discourse contains vertices and edges

Examples of MSO expressions for graphs

1. “There is a vertex of degree at least three”

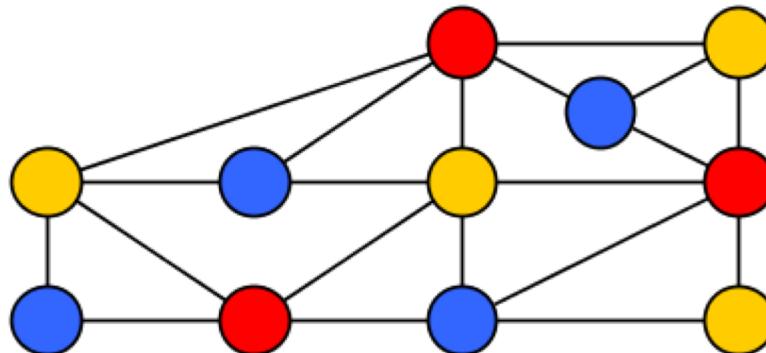
$$\exists x \exists u \exists v \exists w : u \neq v \wedge u \neq w \wedge v \neq w \wedge \\ Adj(x, u) \wedge Adj(x, v) \wedge Adj(x, w)$$

Examples of MSO expressions for graphs

2. “The vertices can be colored red, green, blue such that the endpoints of each edge receive different colors”

$\exists R \exists G \exists B:$

$$\begin{aligned} & (\forall x: Vtx(x) \rightarrow (x \in R \vee x \in G \vee x \in B)) \wedge \\ & (\forall x \forall y: Adj(x, y) \rightarrow \\ & \neg((x \in R \wedge y \in R) \vee (x \in G \wedge y \in G) \vee (x \in B \vee y \in B))) \end{aligned}$$



Examples of MSO expressions for graphs

3. “There is an independent set of 4 vertices”

$$\exists x_1 \dots x_4: \bigwedge_{i=1}^4 Vtx(x_i) \wedge \bigwedge_{1 \leq i < j \leq 4} (x_i \neq x_j \wedge \neg Adj(x_i, x_j))$$

Exercise: Formulating properties in MSO

Which formula ϕ expresses “the graph is connected”?

(Hint: negate “ G has 2 different connected components”)

Courcelle's theorem

Courcelle's theorem. Given a formula ϕ in monadic second-order logic and an n -vertex graph G of treewidth w , one can determine whether $G \models \phi$ in time $f(|\phi|, w) \cdot n$.

Extension to optimization problems:

Courcelle's theorem. Given a formula ϕ in monadic second-order logic and an n -vertex graph G of treewidth w , that contains a free set variable X , one can find a maximum-size X such that $(G, X) \models \phi$ in time $f(|\phi|, w) \cdot n$.

Same holds for cliquewidth if ϕ does not quantify over edge sets

Summary

Graph parameters have **algorithmic & combinatorial** applications

Solve problems on treelike graphs by **dynamic programming**

Courcelle's theorem links this to monadic second-order logic

Treewidth shows up in problems where you don't expect it

Use the parameter hierarchy to guide the attack on a problem!

