



A Simple Linear-Time Algorithm for Finding Path-Decompositions of Small Width

Kevin Cattell Michael J. Dinneen Michael R. Fellows

Department of Computer Science
University of Victoria
Victoria, B.C. Canada V8W 3P6

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Outline

- 1 Introduction
 - Motivation
 - History
- 2 Preliminary Definitions
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 - Topological tree obstructions
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 - Linear-time algorithm
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 - Other results



Motivation

- **Pathwidth** is related to several VLSI layout problems:
 - vertex separation [▶ link](#)
 - gate matrix layout
 - edge search number
 - ...
- Usefulness of bounded **treewidth** in:
 - study of graph minors (Robertson and Seymour)
 - input restrictions for many NP-complete problems
 - (fixed-parameter complexity)



History

- General problem(s) is NP-complete
Input: Graph G , integer t
Question: Is $\text{tree/path-width}(G) \leq t$?
- Algorithmic development (fixed t):
 - $O(n^2)$ **nonconstructive** treewidth algorithm by Robertson and Seymour (1986)
 - $O(n^{t+2})$ treewidth algorithm due to Arnberg, Corneil and Proskurowski (1987)
 - $O(n \log n)$ treewidth algorithm due to Reed (1992)
 - $O(2^{t^2} n)$ treewidth algorithm due to Bodlaender (1993)
 - $O(n \log^2 n)$ pathwidth algorithm due to Ellis, Sudborough and Turner (1994)



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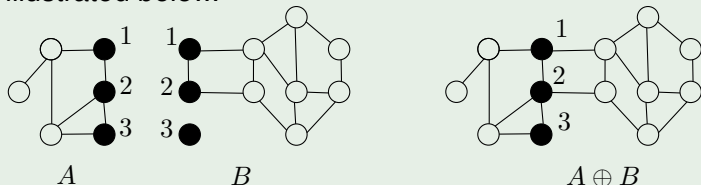


Boundaried graphs

- A distinguished set of vertices labeled $1, 2, \dots, k$, is called the **boundary** of a (finite simple) graph.
- A boundary size k *factorization* of a graph G is two **k -boundaried graphs** A and B such that $G = A \oplus B$.

Example

The \oplus operator on two 3-boundaried graphs A and B is illustrated below.





Path-decompositions

Definition

A *path-decomposition* of a graph $G = (V, E)$ is a sequence X_1, X_2, \dots, X_r of subsets of V that satisfy the following:

- 1 $\bigcup_{1 \leq i \leq r} X_i = V$,
- 2 for every edge $(u, v) \in E$, there exists an X_i such that $u \in X_i$ and $v \in X_i$, and
- 3 for $1 \leq i < j < k \leq r$, $X_i \cap X_k \subseteq X_j$.

Definition

The *pathwidth* of a path-decomposition X_1, X_2, \dots, X_r is $\max_{1 \leq i \leq r} |X_i| - 1$. The *pathwidth* of a graph G is the minimum pathwidth over all path-decompositions of G .



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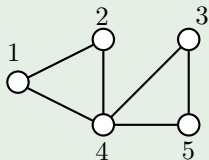
Graph embeddings

Definition

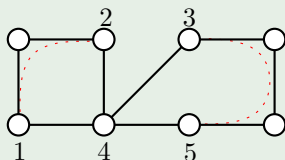
An (*homeomorphic*) embedding of a graph $G_1 = (V_1, E_1)$ in a graph $G_2 = (V_2, E_2)$ is an injection from vertices V_1 to V_2 such that the edges E_1 are mapped to disjoint paths of G_2 .

Example

G_1



G_2





Topological order

Definition

The set of homeomorphic embeddings between graphs gives a partial order, called the *topological order*.

Definition

A *lower ideal* \mathcal{J} in a partial order (\mathcal{U}, \geq) is a subset of \mathcal{U} such that if $X \in \mathcal{J}$ and $X \geq Y$ then $Y \in \mathcal{J}$. The *obstruction set* for \mathcal{J} is the set of minimal elements of $\mathcal{U} - \mathcal{J}$.



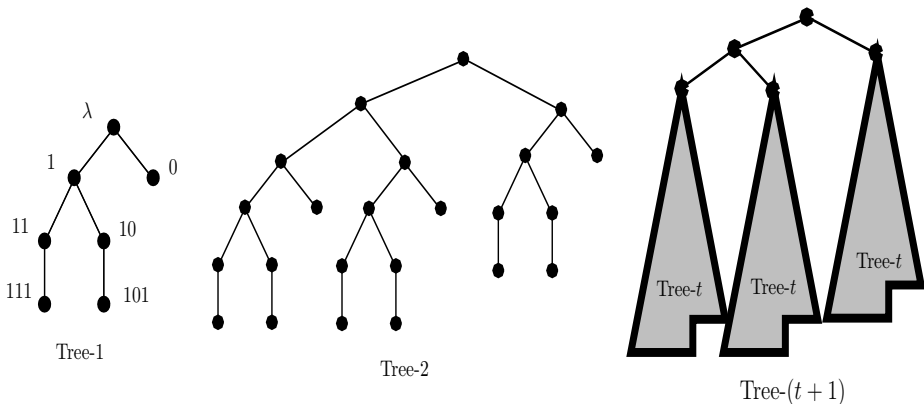
Recursively generated tree obstructions

Some recursive rules for generating all topological tree obstructions of pathwidth t :

- 1 The tree K_2 is the only obstruction of pathwidth 0.
- 2 If T_1, T_2 and T_3 are any 3 tree obstructions for pathwidth t then the tree T consisting of a new degree 3 vertex attached to any vertex of T_1, T_2 and T_3 is a tree obstruction for pathwidth $t + 1$.



Embedding tree obstructions in binary trees.



This shows that the complete binary tree of height $h(t) = 2t + \underline{1}$ and order $f(t) = 2^{2t + \underline{1}} - 1$ has pathwidth greater than t .



Main result

Theorem

Let H be an arbitrary undirected graph, and let t be a positive integer. One of the following two statements must hold:

- 1 The pathwidth of H is at most $f(t) - 1$.*
- 2 H can be factored: $H = A \oplus B$, where A and B are bounded graphs with boundary size $f(t)$, the pathwidth of A is greater than t and less than $f(t)$.*



Proof idea of main result

- Assume we can embed a *guest tree* $B_{h(t)}$ in the *host graph* H then we know that the pathwidth of H is greater than t .
 (e.g. height $h(t) \geq \lg f(t)$)
- Refer to the vertices of $B_{h(t)}$ as **tokens**, and call tokens *placed* (or *unplaced*) if they are (not) mapped to vertices of H in the current partial embedding.
 A vertex v of H is *tokened* if a token maps to v .
- Let $P[i]$ denote the set of vertices of H that are tokened at time step i .
 The sequence $P[0], P[1], \dots, P[s]$ will describe either a path-decomposition of H or of a factor A .



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Identifying tokens and tokened vertices

We recursively label the tokens of the guest binary tree by the following standard rules:

- 1 The root token of $B_{h(t)}$ is labeled by the empty string λ .
- 2 The left child token and right child token of a height h parent token $P = b_1 b_2 \cdots b_h$ are labeled $P \cdot 1$ and $P \cdot 0$, respectively.

The token placement algorithm is described as follows.

- 1 Initially consider that every vertex of H is colored blue.
- 2 A vertex of H has its color changed to red when a token is placed on it, and stays red if the token is removed.
- 3 Only blue vertices can be tokened, and so a vertex can only receive a token once.



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Linear-time algorithm (grow part)

- ```
function GrowTokenTree
1 if root token λ is not placed on H then
 arbitrarily place λ on a blue vertex of H
endif
2 while there is a vertex $u \in H$ with token T and blue neighbor v ,
 and token T has an unplaced child $T \cdot b$ do
 2.1 place token $T \cdot b$ on v
endwhile
3 return {tokened vertices of H }
```



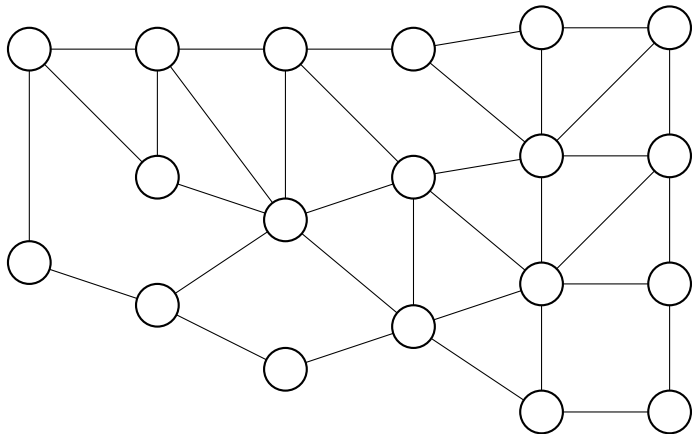
## Linear-time algorithm (main program)

```
program PathDecompositionOrSmallFatFactor
1 $i \leftarrow 0$
2 $P[i] \leftarrow$ call GrowTokenTree
3 until $|P[i]| = f(t)$ or H has no blue vertices repeat
 3.1 pick a token T with an unplaced child token
 3.2 remove T from H
 3.3 if T had one tokened child then
 replace all tokens $T \cdot b \cdot S$ with $T \cdot S$
 endif
 3.4 $i \leftarrow i + 1$
 3.5 $P[i] \leftarrow$ call GrowTokenTree
enduntil
done
```



## Illustration of algorithm execution

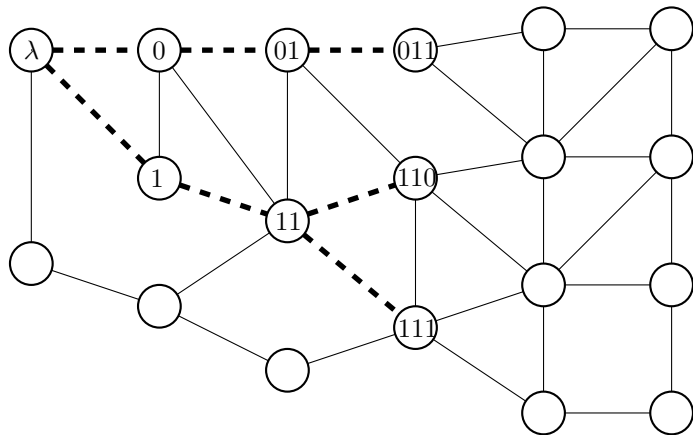
Trying to embed a complete binary tree of height 3.





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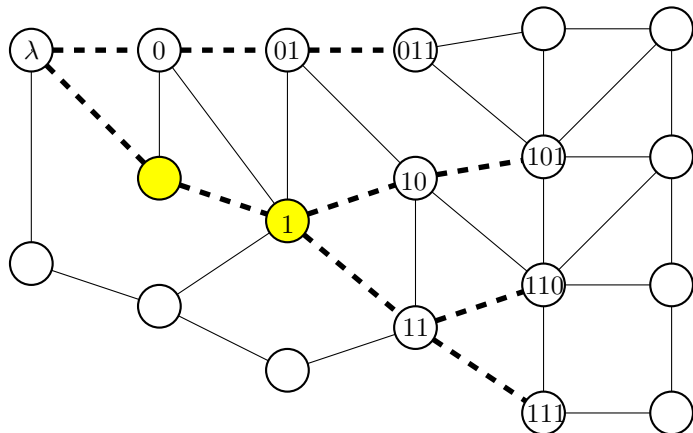
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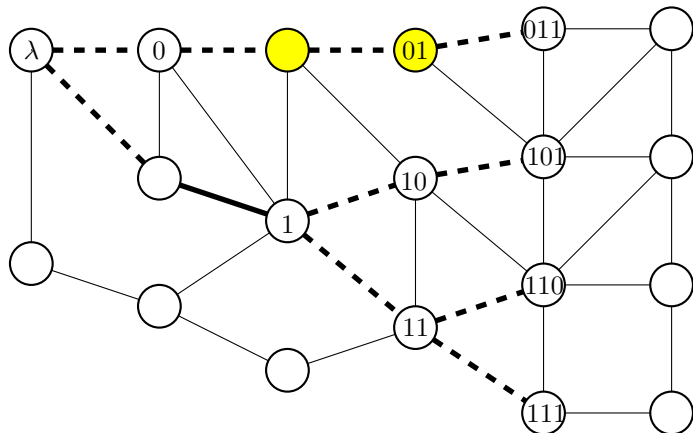
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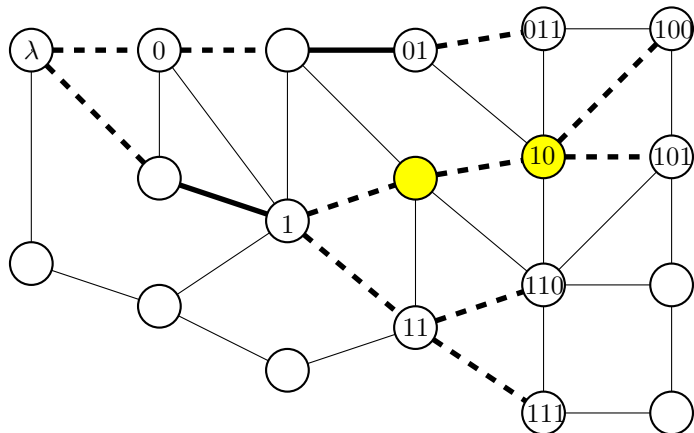






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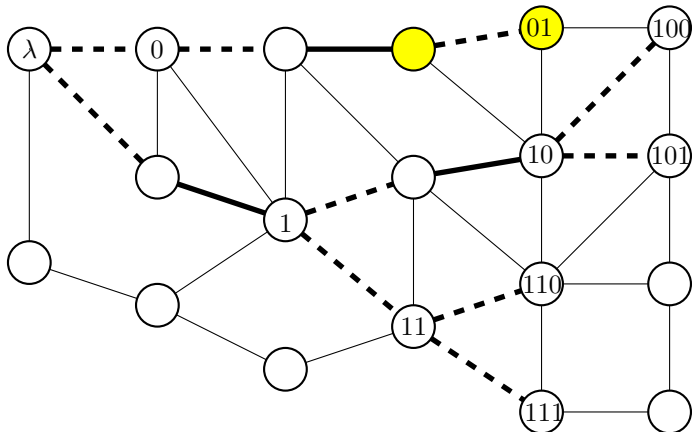
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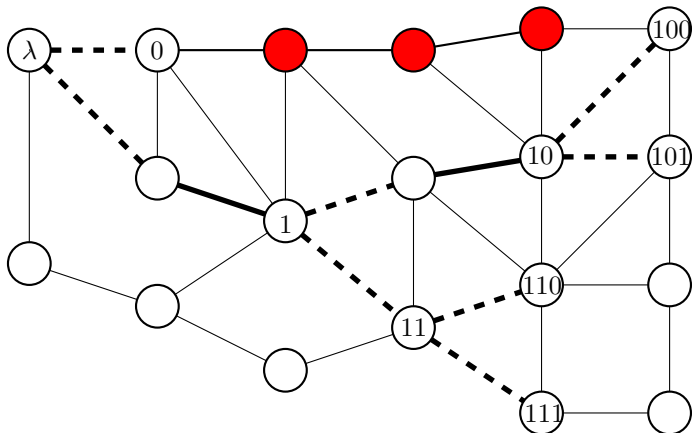
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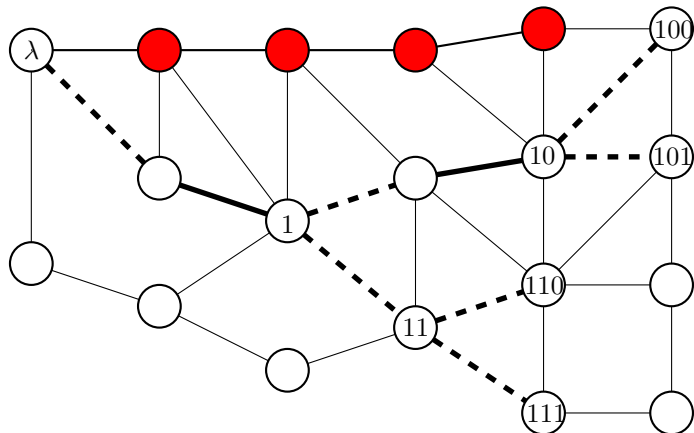
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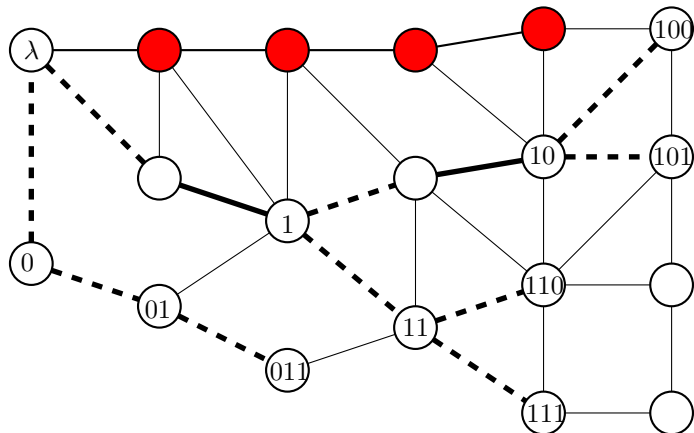
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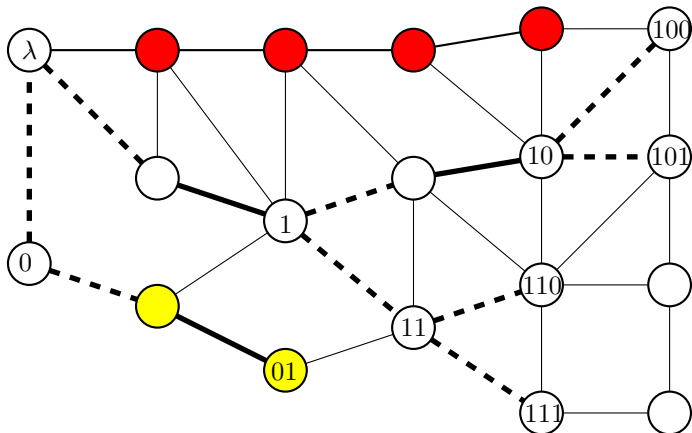
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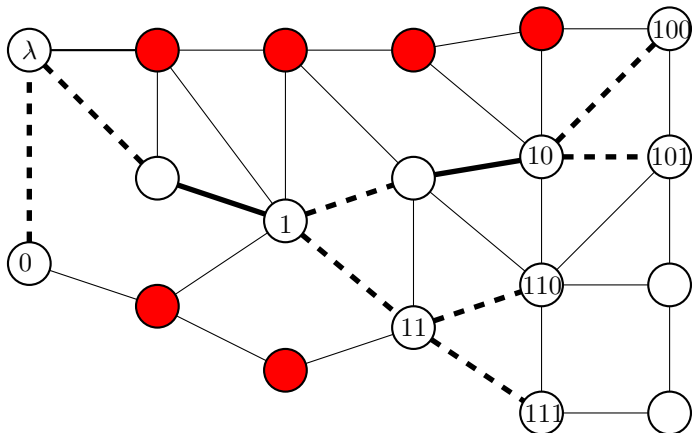
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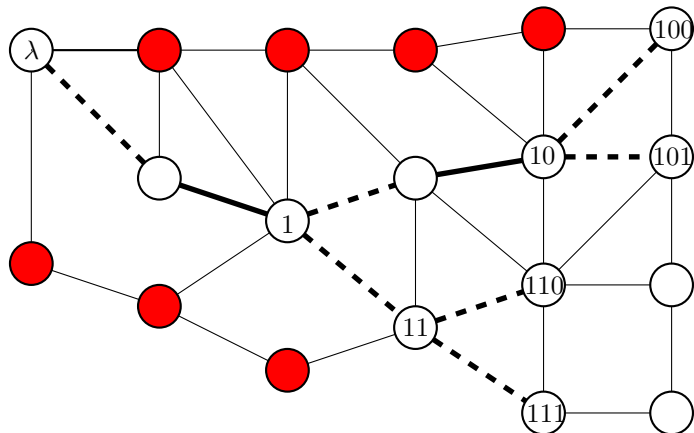
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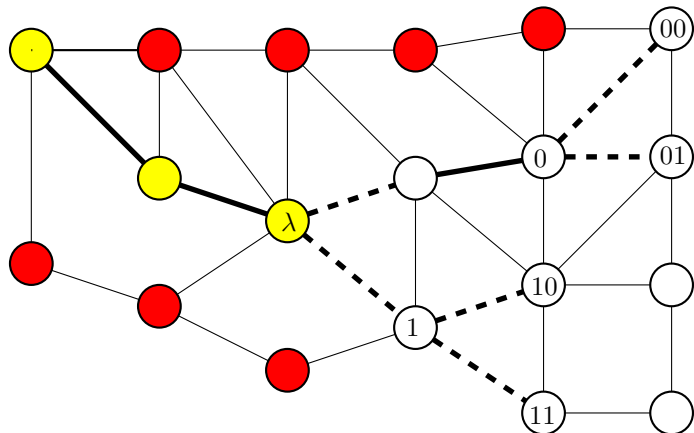






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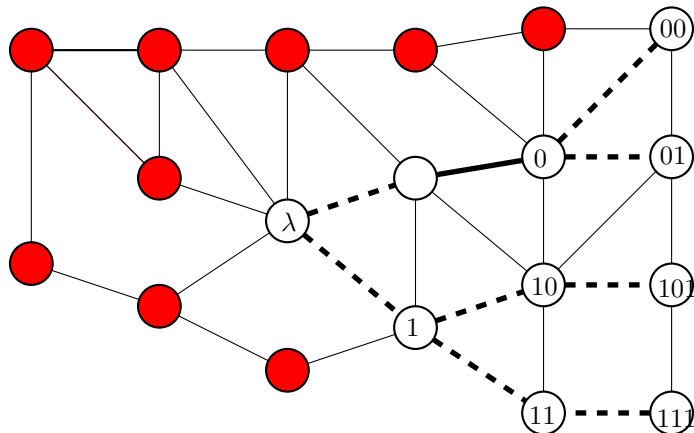
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## Why the algorithm is correct (1 of 2)

Some properties of the algorithm:

- The root token  $\lambda$  of  $B_{h(t)}$  is placed at most once for each component of  $H$ . But can move in [steps 3.2-3.3](#).
- GrowTokenTree only returns when either  $B_{h(t)}$  is completely embedded or there are no **blue** neighbors for the unplaced tokens.
- The algorithm terminates since each iteration of [step 3.2](#) a tokened **red** vertex becomes untokened.  
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## Why the algorithm is correct (2 of 2)

Why  $P[0], \dots, P[s]$  is a path-decomposition of  $H$  or  $A$ ?

- Since each vertex  $u$  is tokened at most once, the interpolation property holds.
- Let  $(u, v)$  be an edge and assume vertex  $u$  is tokened first. We only untoken a vertex when there is an unplaced child token step 3.2.

Thus, vertex  $v$  will be tokened as a child token of  $u$ .

Therefore, there is some  $P[i]$  containing both  $u$  and  $v$ .

If all tokens of  $B_{h(t)}$  are embedded into a subgraph of  $H$  we claim that  $A$  contains a subdivision of  $B_{h(t)}$ .

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## Why the algorithm runs in linear time

- If graph  $H$  has more than  $t \cdot n$  edges then the pathwidth is greater than  $t$  (i.e. input has  $O(n)$  edges).
- All operations on  $B_{h(t)}$  are constant time.
- In GrowTokenTree `step 2` if we find an edge  $(u, v)$  where  $v$  is a red vertex, we can delete it.  
Also it is safe to remove  $(u, v)$  after `step 2.1`.  
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## Other results

### Corollary

*Any subtree of the binary tree  $B_{h(t)}$  that has pathwidth greater than  $t$  may be used in the pathwidth algorithm.*

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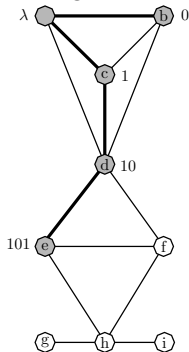
*Every graph with no minor isomorphic to forest  $F$ , where  $F$  is a minor of a complete binary tree  $B$ , has pathwidth at most  $c = |B| - 2$ .*

This is basically the main result of Bienstock, Robertson, Seymour and Thomas (1991) that for any forest  $F$  there is a constant  $c$ , such that any graph not containing  $F$  as a minor has pathwidth at most  $c$ .

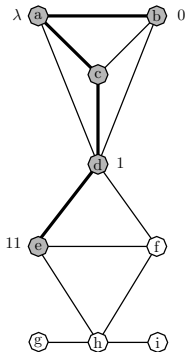


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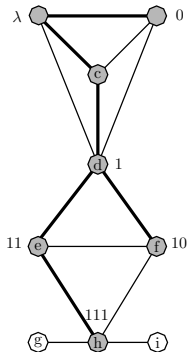
Trying to directly embed the **Tree-1** obstruction.



After step 2,  
 $P[0] = \{a, b, c, d, e\}$



After 3.3,  $T = 1$

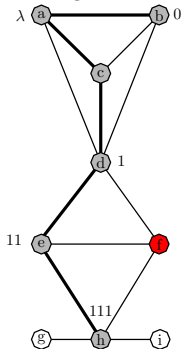


After 3.5  
 $P[1] = \{a, b, d, e, f, h\}$



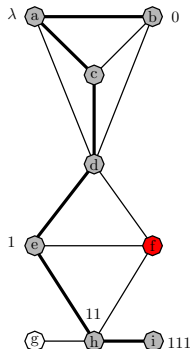
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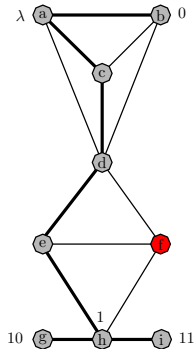
$T = 10$ , after 3.5

$P[2] = \{a, b, d, e, h\}$



$T = 1$ , after 3.5

$P[3] = \{a, b, e, h, i\}$



$T = 1$ , after 3.5

$P[4] = \{a, b, g, h, i\}$



# Summary

We have presented a simple linear-time algorithm (for each fixed constant  $t$ ) that either establishes that the pathwidth of a graph is greater than  $t$ , or finds a path-decomposition of width at most  $O(2^t)$ .

- The width is equal to the number of tokens used. In practice this may be smaller than the complete binary tree.
- Can the width of the path-decomposition be bounded to the number of vertices in tree obstructions?
- There may be placement heuristics that can improve our performance on “typical” instances.





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# Thank you!



# Vertex separation

## Definition

A **layout**  $L$  of a graph  $G = (V, E)$  is a one to one mapping  $L : V \rightarrow \{1, 2, \dots, |V|\}$ .

For a graph  $G = (V, E)$  we conveniently write a layout  $L$  as a permutation of the vertices  $(v_1, v_2, \dots, v_n)$ .

For any layout  $L = (v_1, v_2, \dots, v_n)$  of  $G$  let

$$V_i = \{v_j \mid j \leq i \text{ and } (v_j, v_k) \in E \text{ for some } k > i\}$$

for each  $1 \leq i \leq n$ .

## Definition

The **vertex separation** of a graph  $G$  with respect to a layout  $L$  is  $vs(L, G) = \max_{1 \leq i \leq |G|} \{|V_i|\}$ .

The **vertex separation** of a graph  $G$ , denoted by  $vs(G)$ , is the minimum  $vs(L, G)$  over all layouts  $L$  of  $G$ .