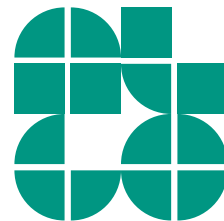


# Algorithms for Graph Visualization

## Layered Layout – Part 2

INSTITUT FÜR THEORETISCHE INFORMATIK · FAKULTÄT FÜR INFORMATIK

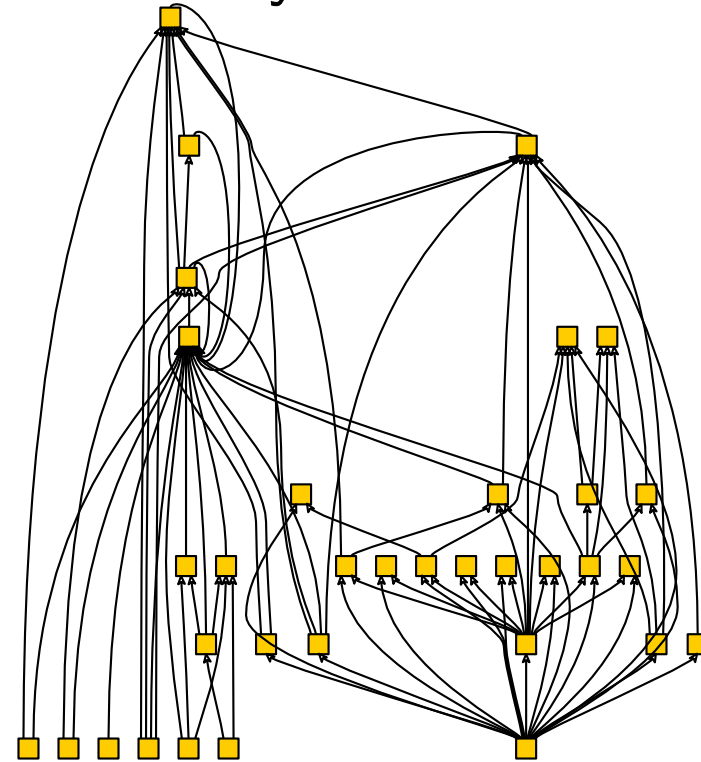
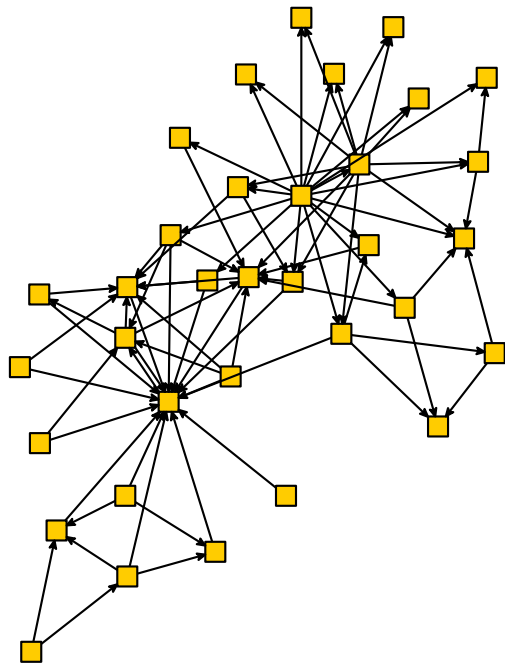
**Tamara Mchedlidze**  
11.1.2018



# Layered Layout

**Given:** directed graph  $D = (V, A)$

**Find:** drawing of  $D$  that emphasizes the hierarchy by positioning nodes on horizontal layers



# Layered Layout

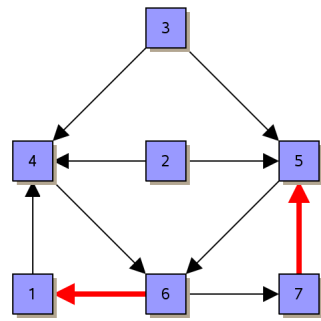
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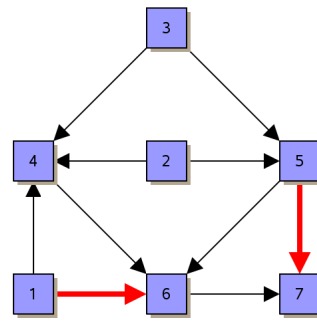
## Criteria:

- many edges pointing to the same direction
- few layers or limited number of nodes per layer
- preferably few edge crossings
- nodes distributed evenly
- edges preferably straight and short

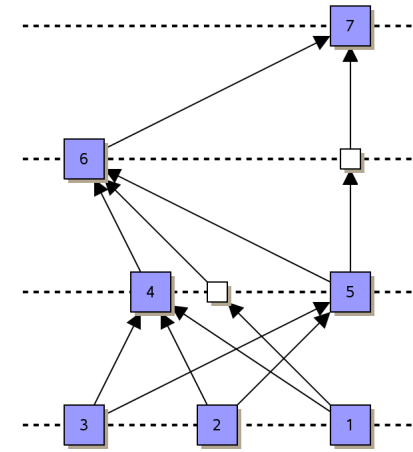
# Sugiyama Framework (Sugiyama, Tagawa, Toda 1981)



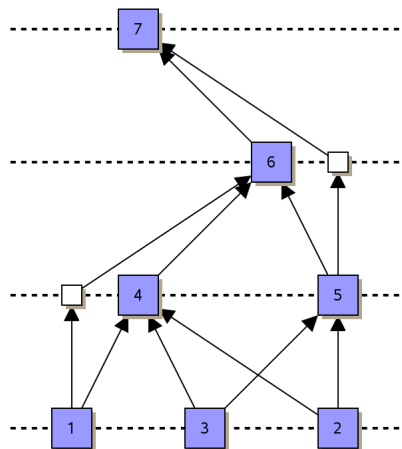
given



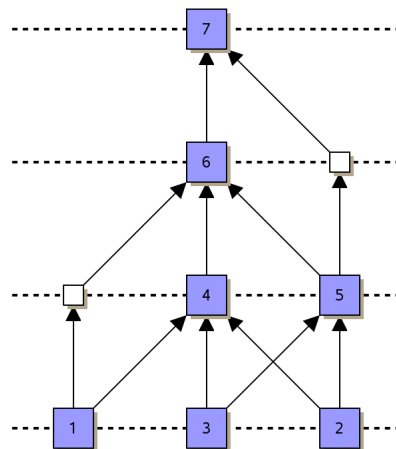
resolve cycles



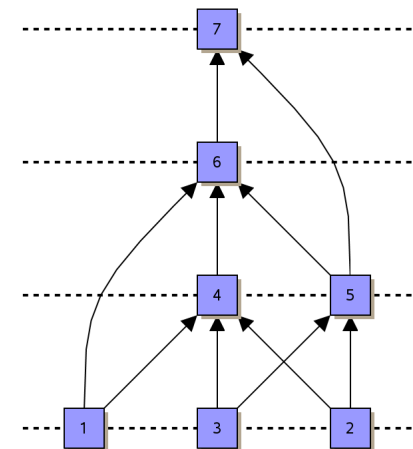
layer assignment



crossing minimization

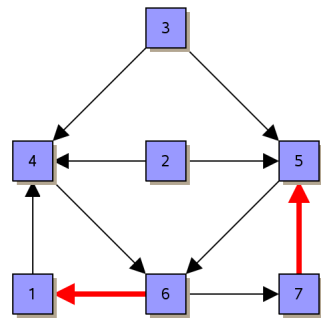


node positioning

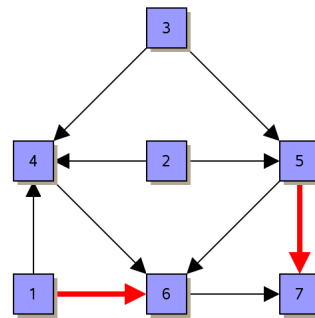


edge drawing

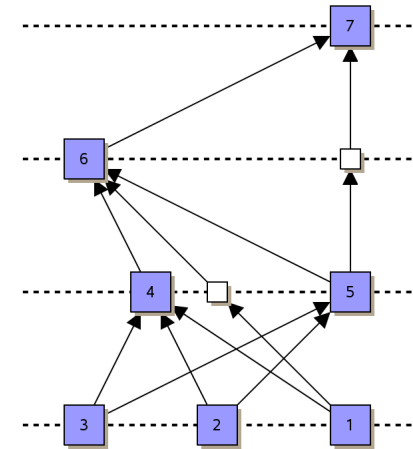
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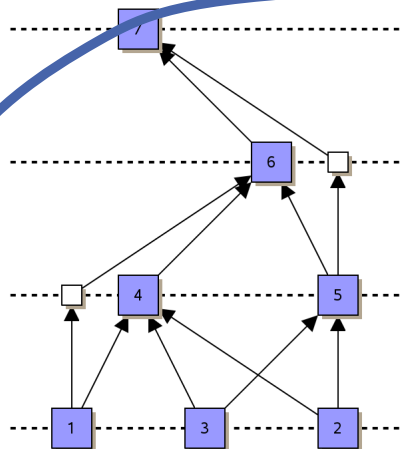
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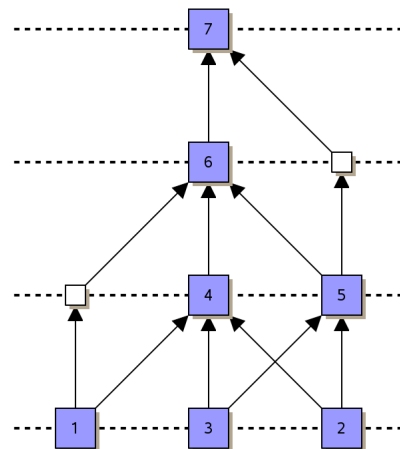
resolve cycles



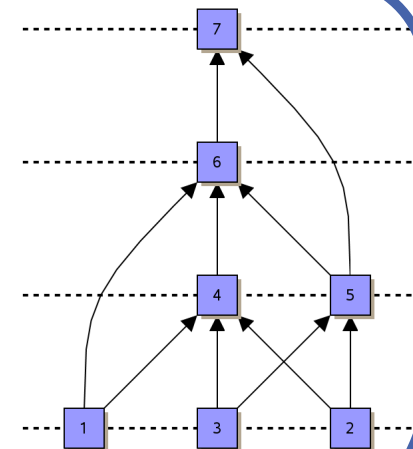
layer  
assignment



crossing minimization



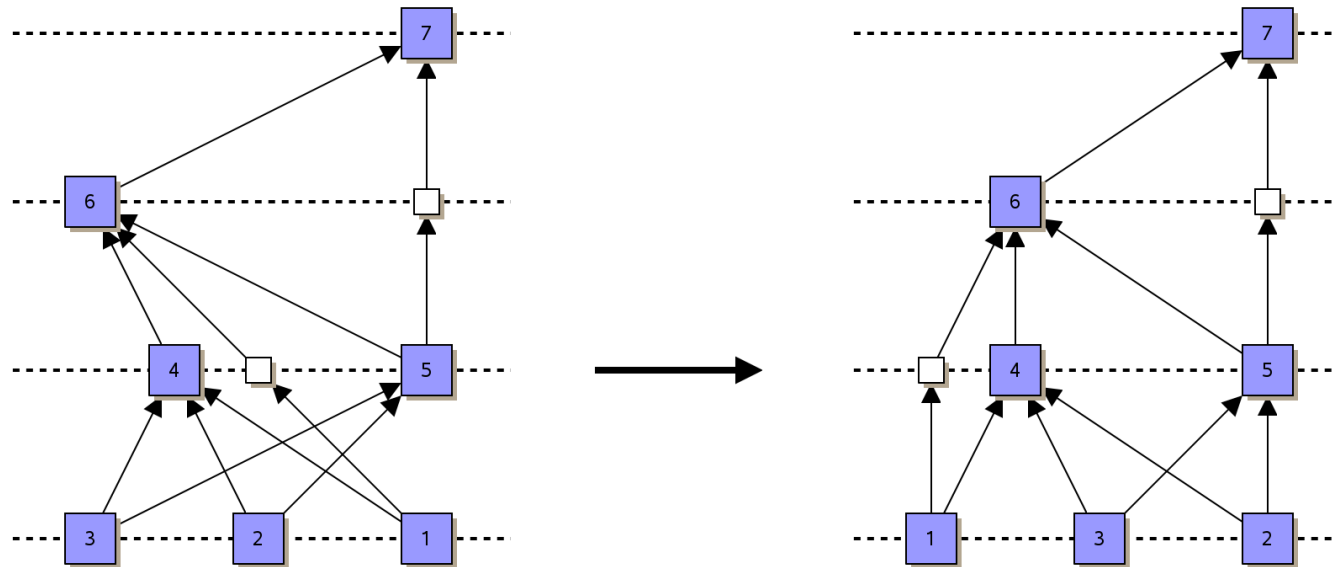
node positioning



edge drawing

3

# Step 3: Crossing Minimization



# Problem Statement

**Given:** DAG  $D = (V, A)$ , nodes are partitioned in disjoint layers

**Find:** Order of the nodes on each layer, so that the number of crossing is minimized

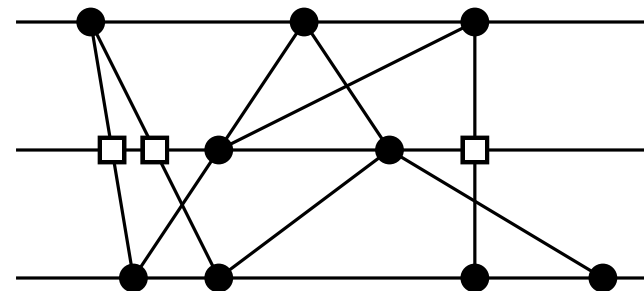
# Problem Statement

**Given:** DAG  $D = (V, A)$ , nodes are partitioned in disjoint layers

**Find:** Order of the nodes on each layer, so that the number of crossing is minimized

## Properties

- Problem is NP-hard even for two layers  
(BIPARTITE CROSSING NUMBER [Garey, Johnson '83])
- No approach over several layers simultaneously
- Usually iterative optimization for two adjacent layers
- For that: insert dummy nodes at the intersection of edges with layers





# One-sided Crossing Minimization (OSCM)

**Given:** 2-Layered-Graph  $G = (L_1, L_2, E)$  and ordering of the nodes  $x_1$  of  $L_1$

**Find:** Node ordering  $x_2$  of  $L_2$ , such that the number of crossing among  $E$  is minimum

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## Observation:

- The number of crossing in 2-layered drawing of  $G$  depends only on ordering of the nodes, not from the exact positions
- for  $u, v \in L_2$  the number of crossing among incident to them edges depends on whether  $x_2(u) < x_2(v)$  or  $x_2(v) < x_2(u)$  and not on the positions of other vertices

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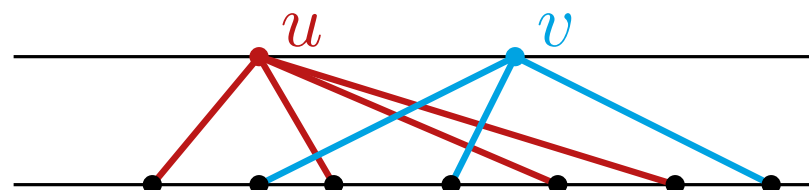
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**Def:**  $c_{uv} := |\{(uw, vz) : w \in N(u), z \in N(v), x_1(z) < x_1(w)\}|$   
for  $x_2(u) < x_2(v)$



$$c_{uv} = 5$$

$$c_{vu} = 7$$

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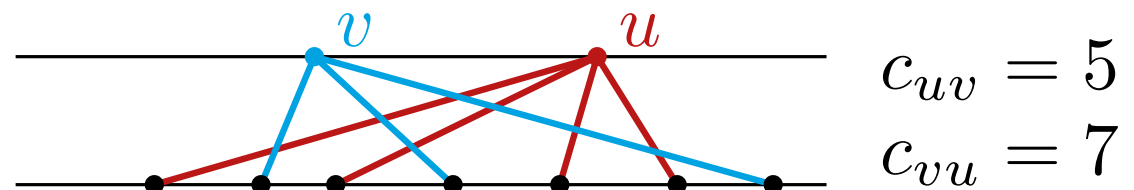
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# Further Properties

**Def:** Crossing number of  $G$  with orders  $x_1$  and  $x_2$  for  $L_1$  and  $L_2$  is denoted by  $\text{cr}(G, x_1, x_2)$ ;  
for fixed  $x_1$  then  $\text{opt}(G, x_1) = \min_{x_2} \text{cr}(G, x_1, x_2)$

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- $\text{opt}(G, x_1) \geq \sum_{\{u,v\}} \min\{c_{uv}, c_{vu}\}$

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Efficient computation of  $\text{cr}(G, x_1, x_2)$  see Exercise.

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**Think for a minute and then share**

Why the second inequality is not an equality?

**1 min**

# Iterative Crossing Minimization

Let  $G = (V, E)$  be a DAG with layers  $L_1, \dots, L_h$ .

- (1) compute a random ordering  $x_1$  for layer  $L_1$
- (2) for  $i = 1, \dots, h - 1$  consider layers  $L_i$  and  $L_{i+1}$  and minimize  $cr(G, x_i, x_{i+1})$  with fixed  $x_i$  ( $\rightarrow$  **OSCM**)
- (3) for  $i = h - 1, \dots, 1$  consider layers  $L_{i+1}$  and  $L_i$  and minimize  $cr(G, x_i, x_{i+1})$  with fixed  $x_{i+1}$  ( $\rightarrow$  **OSCM**)
- (4) repeat (2) and (3) until no further improvement happens
- (5) repeat steps (1)–(4) with another  $x_1$
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**Theorem 1:** The One-Sided Crossing Minimization (OSCM) problem is NP-hard (Eades, Wormald 1994).

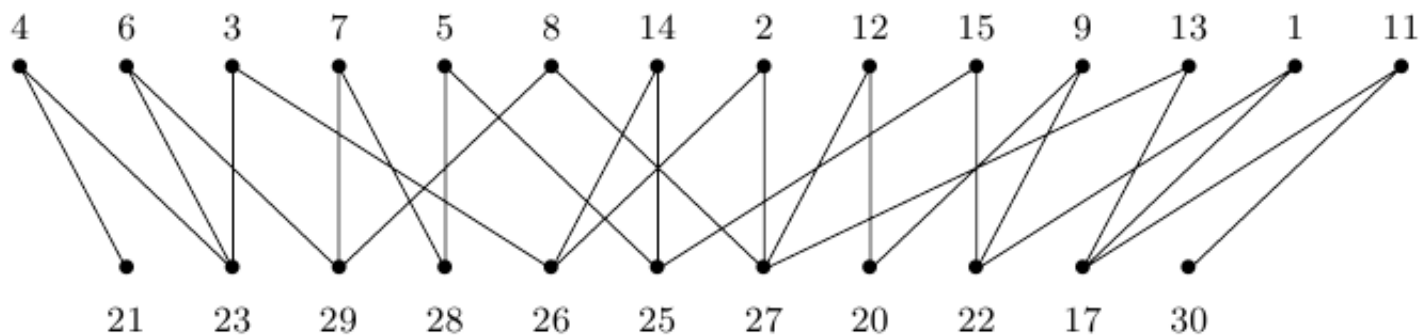
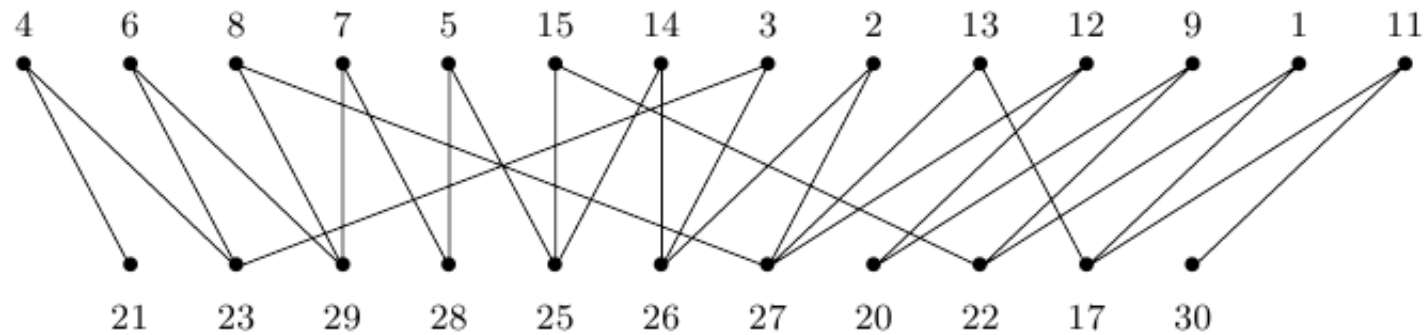
# Algorithms for OSCM

## Heuristics:

- Barycenter
- Median

## Exact:

- ILP Model



# Barycenter Heuristic (Sugiyama, Tagawa, Toda 1981)

**Idea:** few crossing when nodes are close to their neighbours

- set

$$x_2(u) = \frac{1}{\deg(u)} \sum_{v \in N(u)} x_1(v)$$

- in case of equality introduce tiny gap

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## Properties:

- trivial implementation
- quick (exactly?)
- usually very good results
- finds optimum if  $\text{opt}(G, x_1) = 0$  (see Exercises)
- there are graphs on which it performs  $\Omega(\sqrt{n})$  times worse than optimal

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**Work with your neighbour and then share**

Construct an example proving that barycenter method works at least  $\sqrt{n}$  times worse than optimal

**5 min**

**Idea:** use the median of the coordinates of neighbours

- for a node  $v \in L_2$  with neighbours  $v_1, \dots, v_k$  set  
 $x_2(v) = \text{med}(v) = x_1(v_{\lceil k/2 \rceil})$   
and  $x_2(v) = 0$  if  $N(v) = \emptyset$
- if  $x_2(u) = x_2(v)$  and  $u, v$  have different parity, place the node with odd degree to the left
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- Runs in time  $O(|E|)$

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**Properties:**

- trivial implementation
- fast
- mostly good performance
- finds optimum when  $\text{opt}(G, x_1) = 0$
- **Factor-3 Approximation**

# Approximation Factor

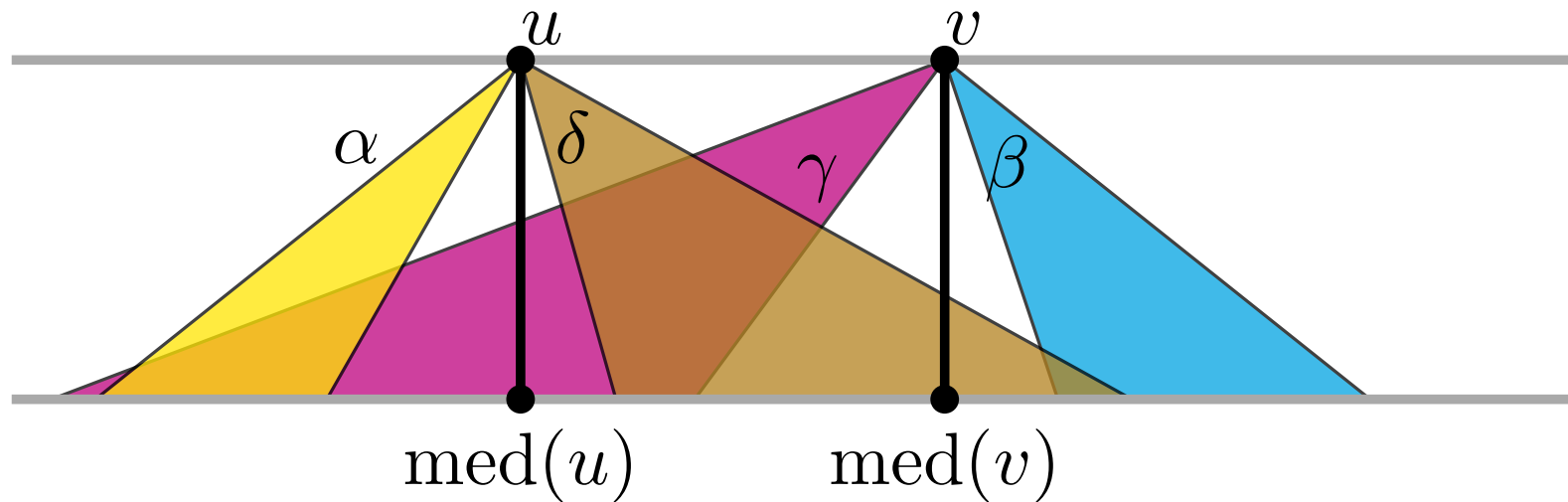
**Theorem 2:** Let  $G = (L_1, L_2, E)$  be a 2-layered graph and  $x_1$  an arbitrary ordering of  $L_1$ . Then it holds that

$$\text{med}(G, x_1) \leq 3 \text{opt}(G, x_1).$$



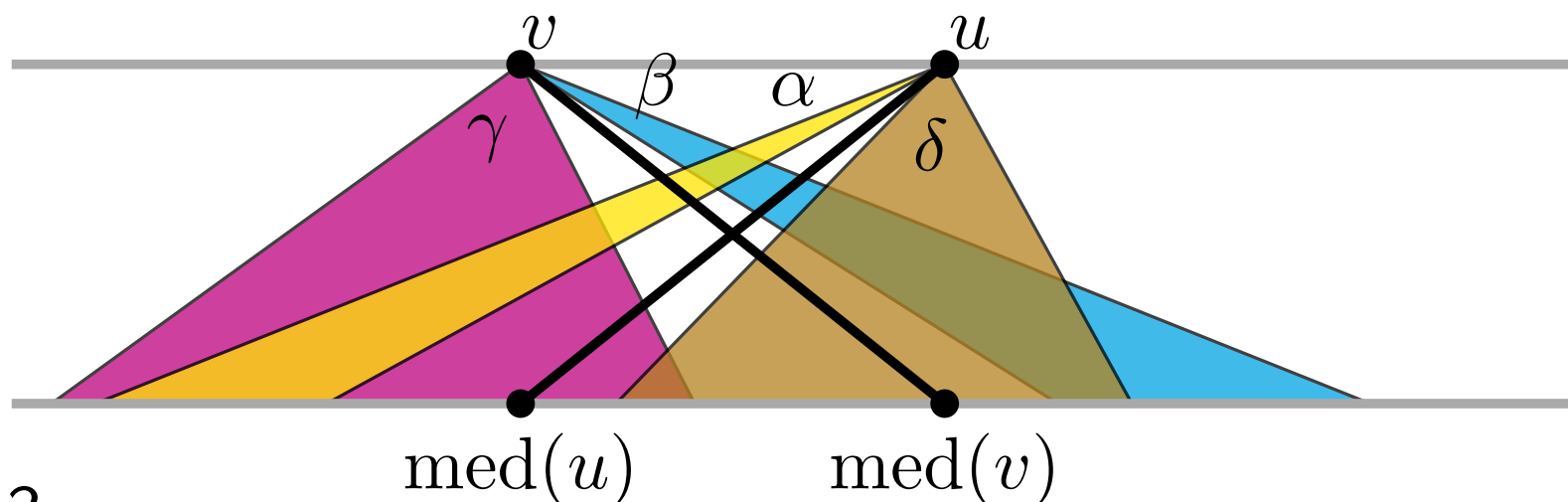
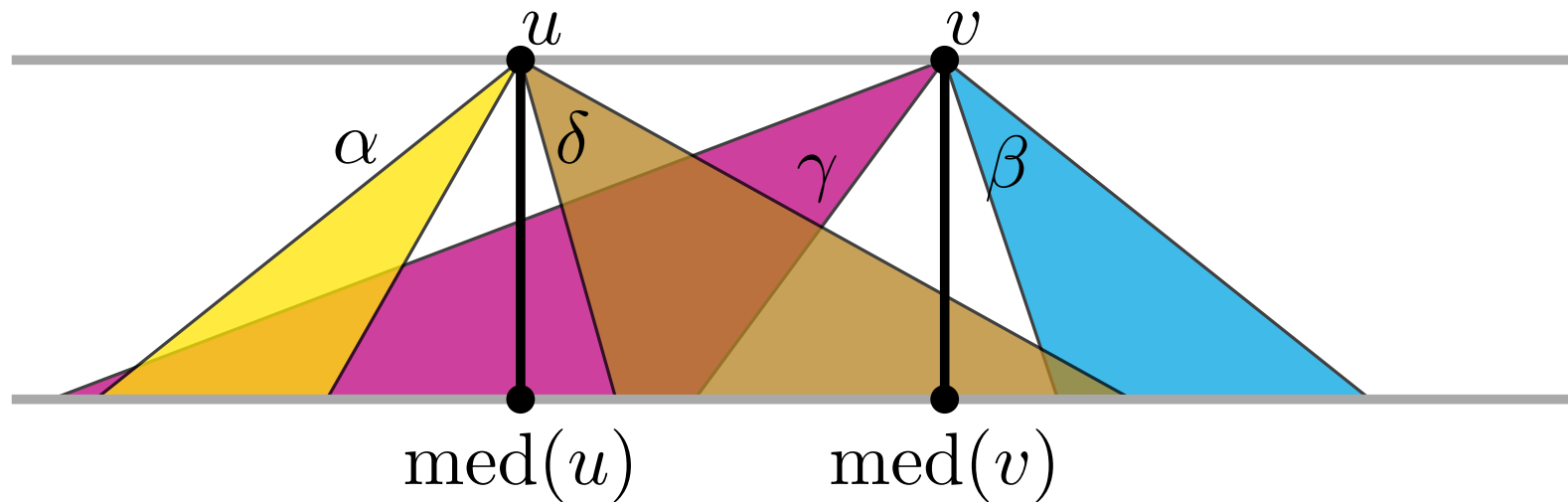
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## Properties:

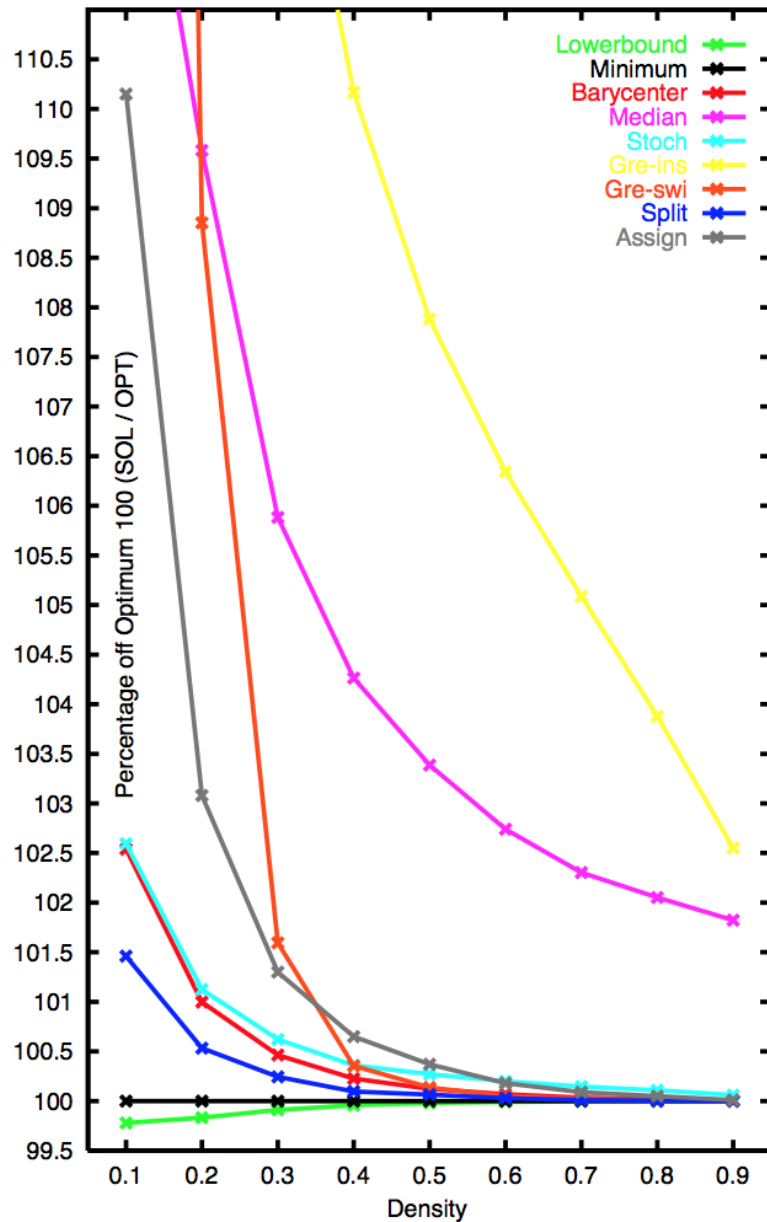
- branch-and-cut technique for DAGS of limited size
- useful for graphs of small to medium size
- finds optimal solution
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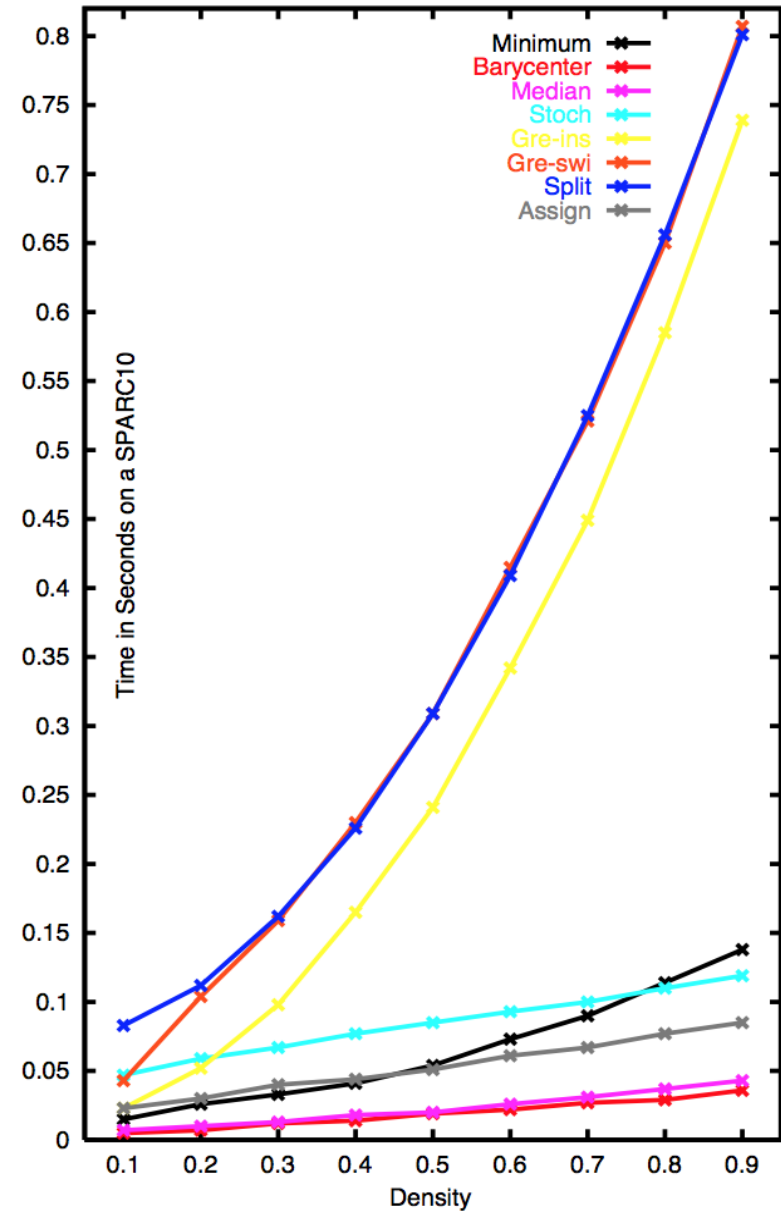
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**Modell:** see Blackboard

# Experimental Evaluation (Jünger, Mutzel 1997)

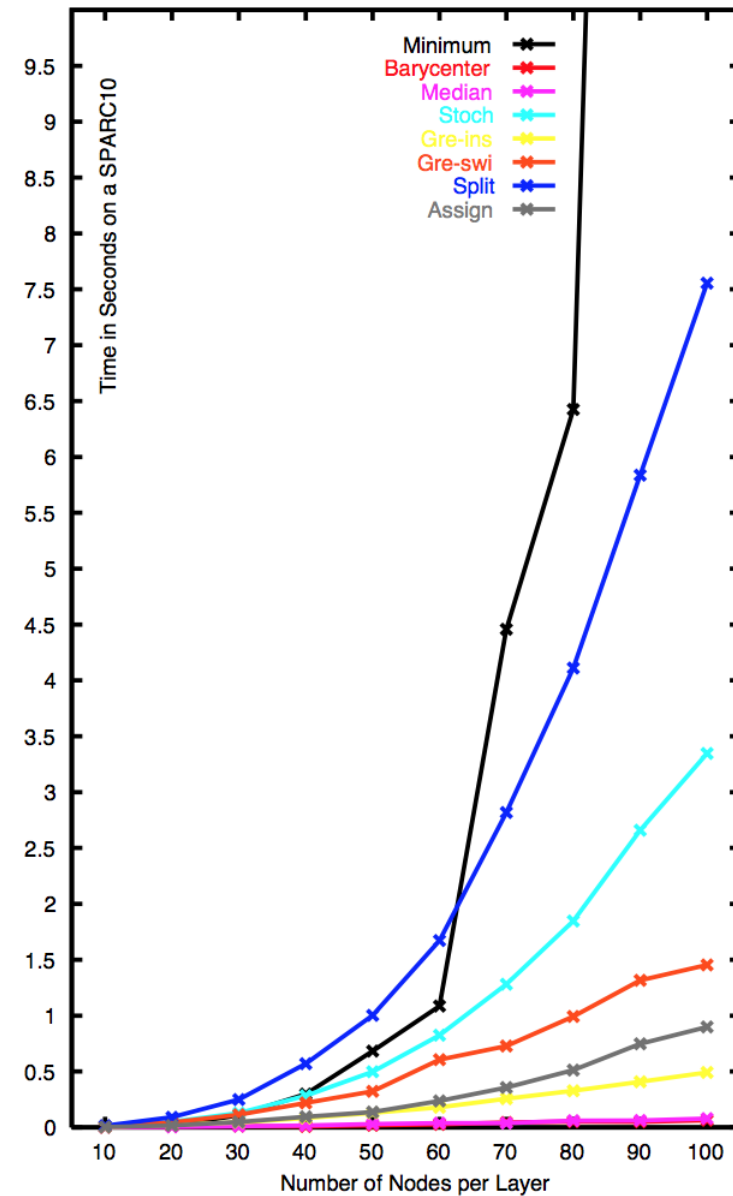
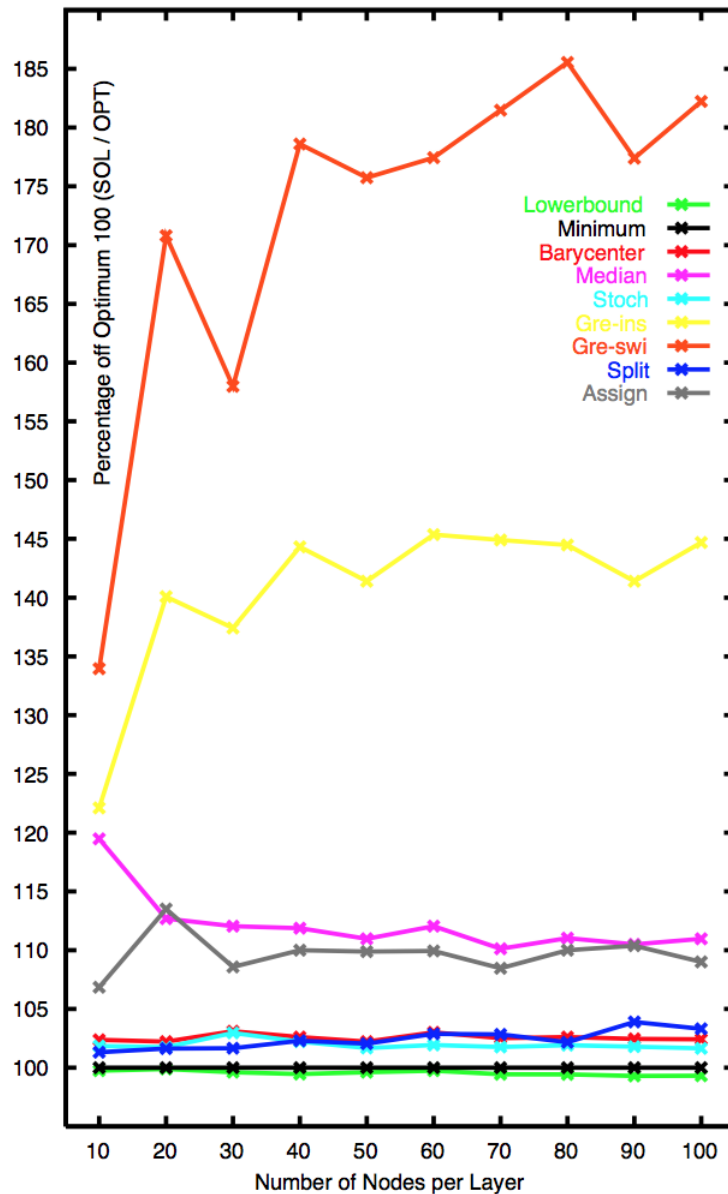


Results for 100 instances on 20 + 20 nodes with increasing density



Time for 100 instances on 20 + 20 nodes with increasing density

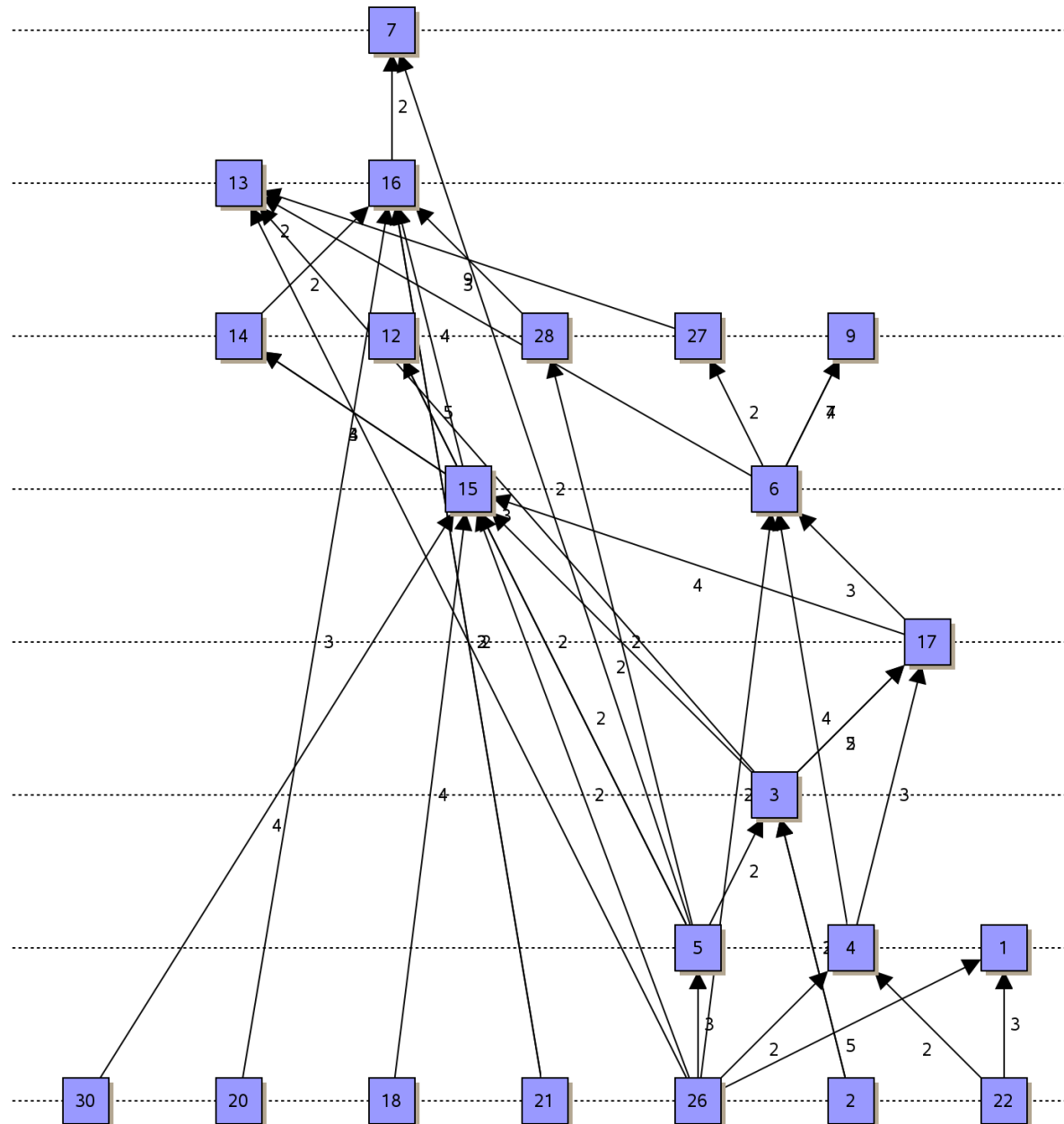
# Experimental Evaluation (Jünger, Mutzel 1997)



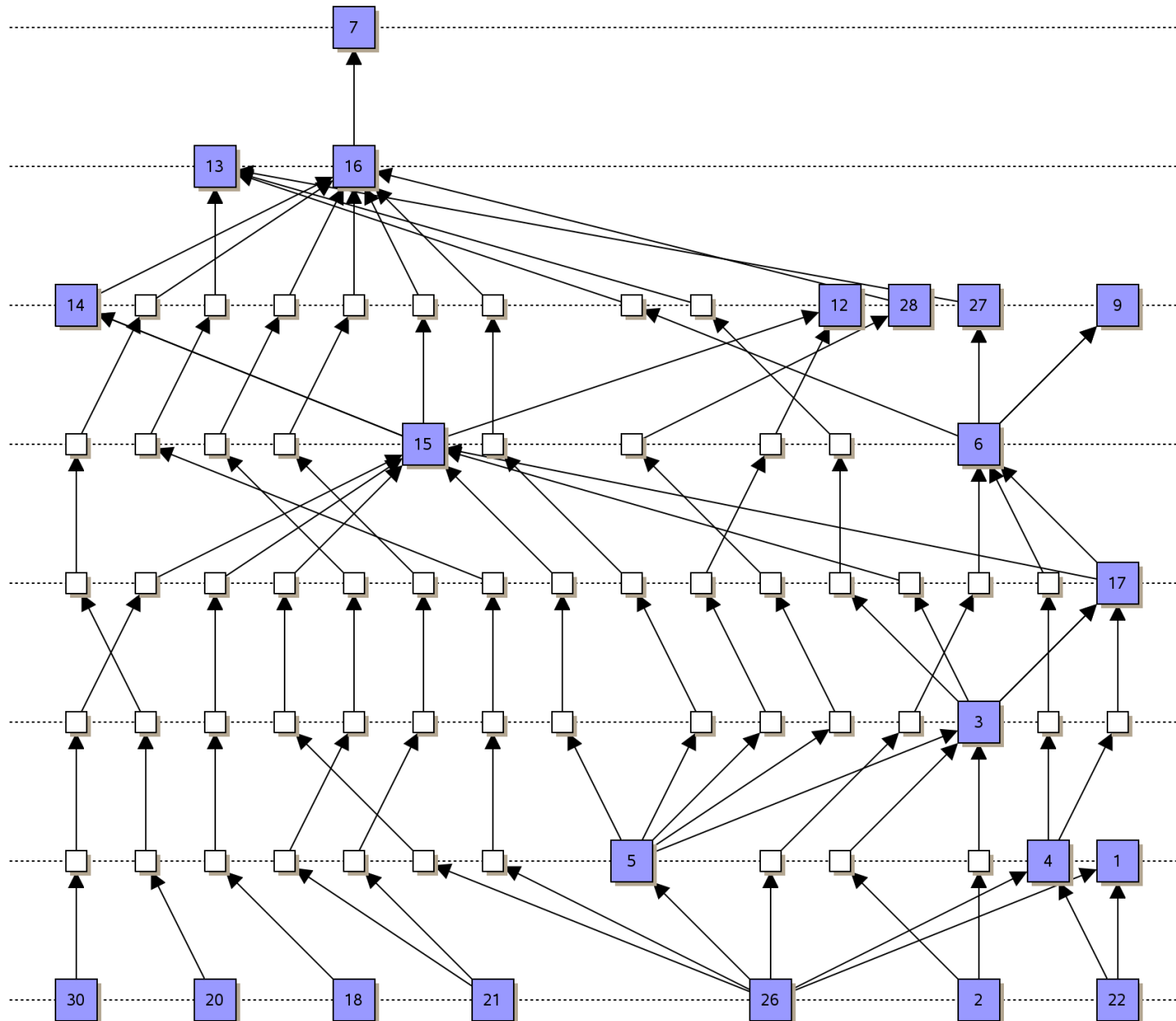
Results for 10 instances of sparse graphs with increasing size

Time for 10 instances of sparse graphs with increasing size

# Example



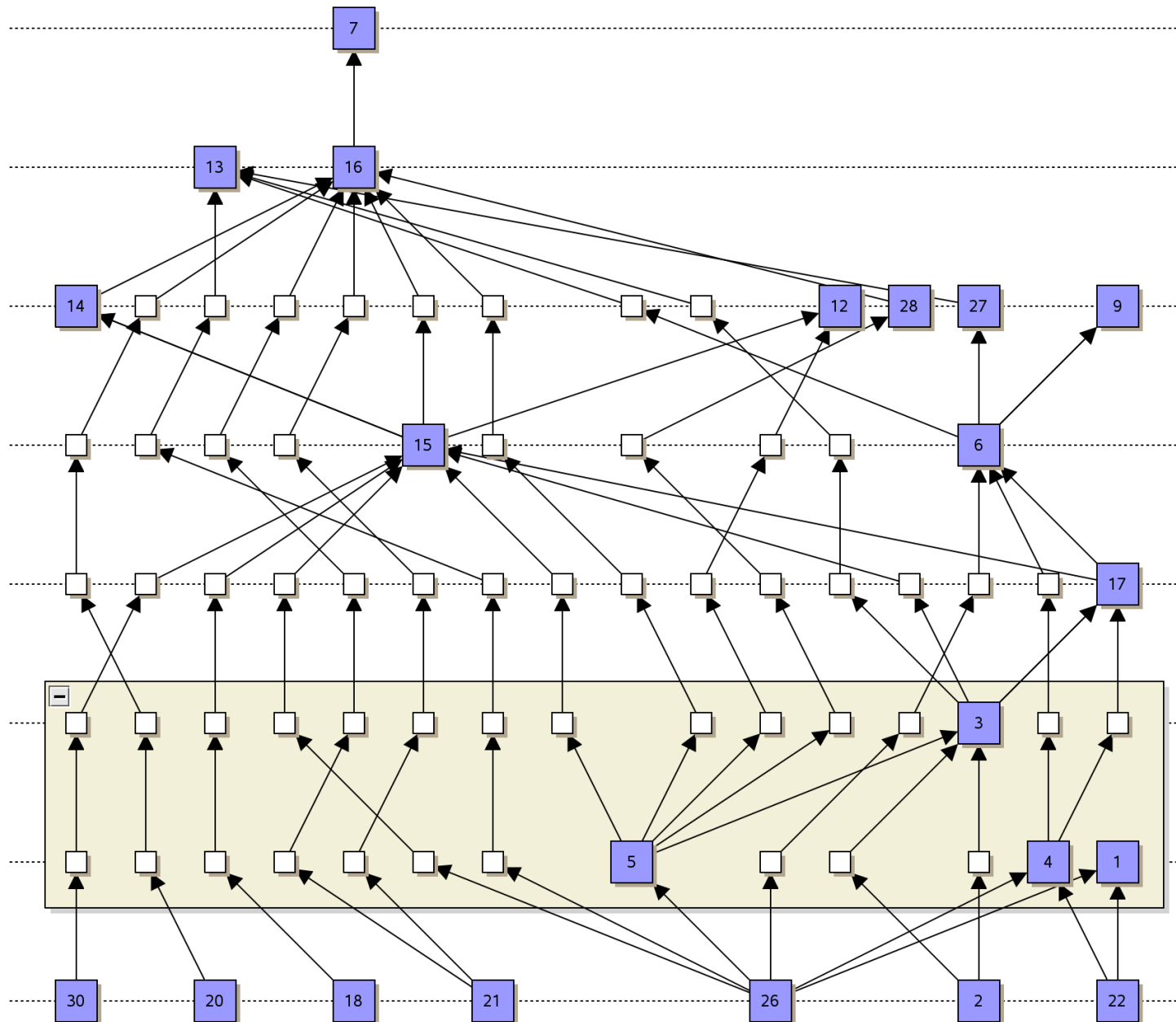
# Example



16 - 2

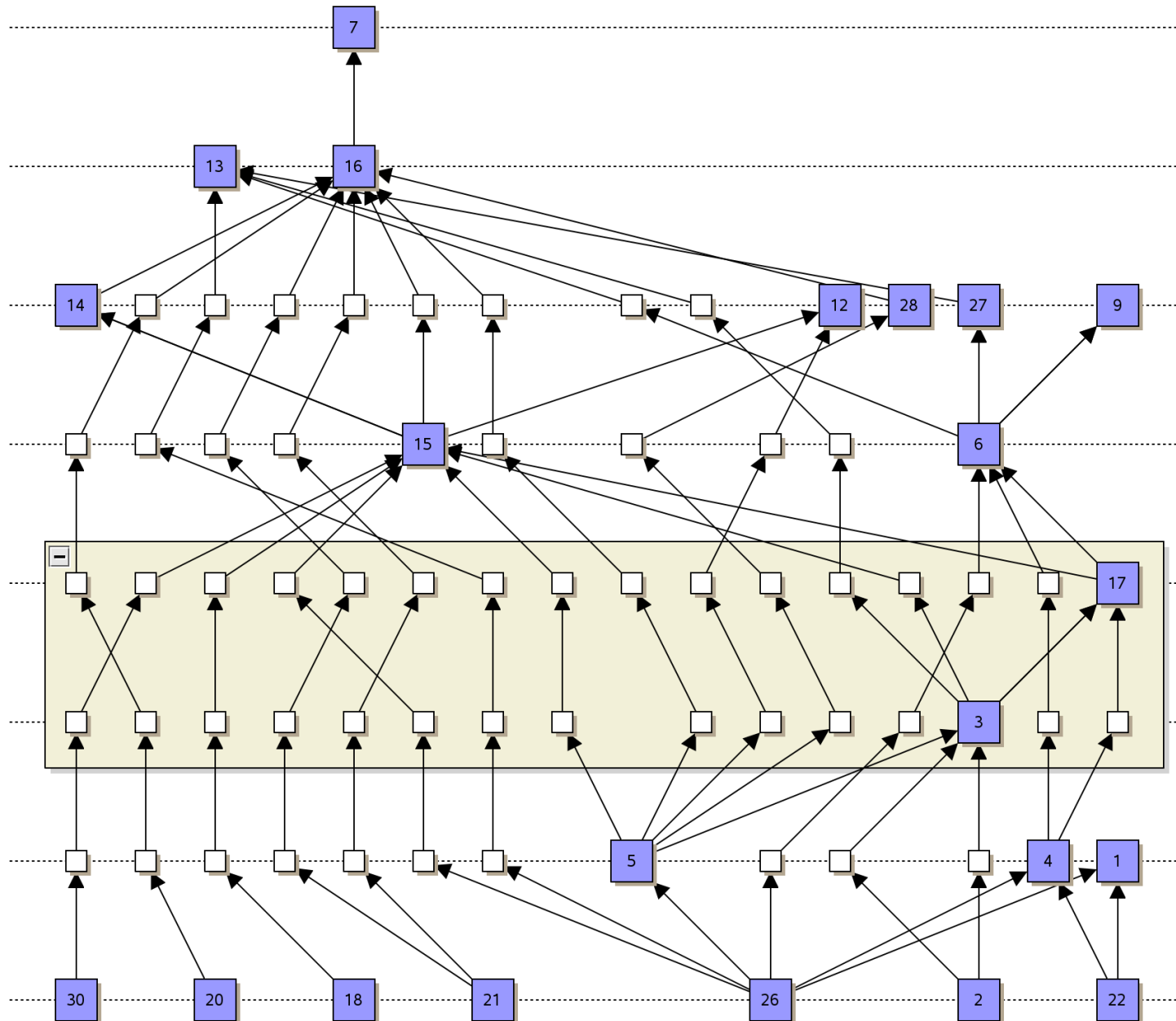


# Example

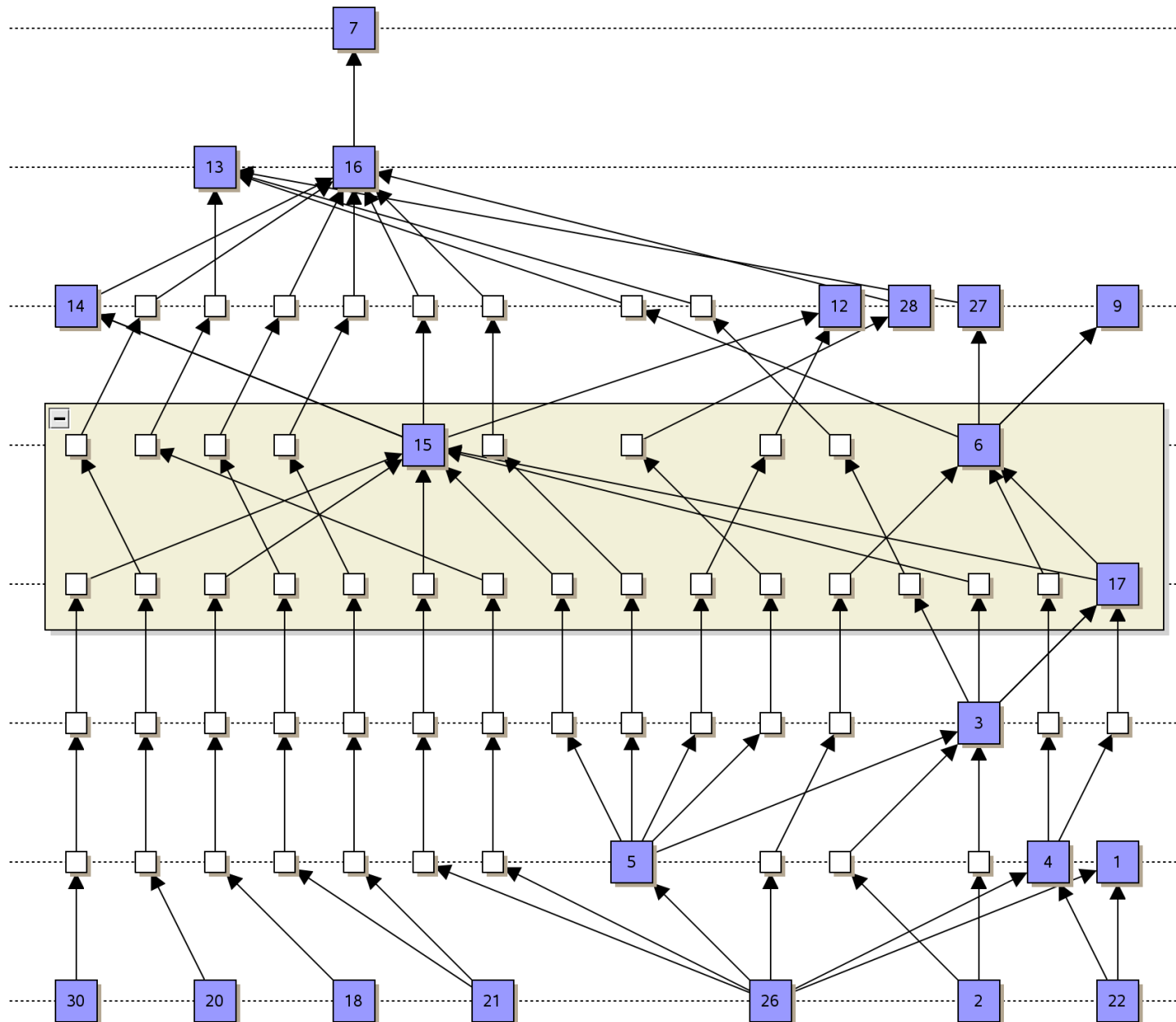


16 - 3

# Example

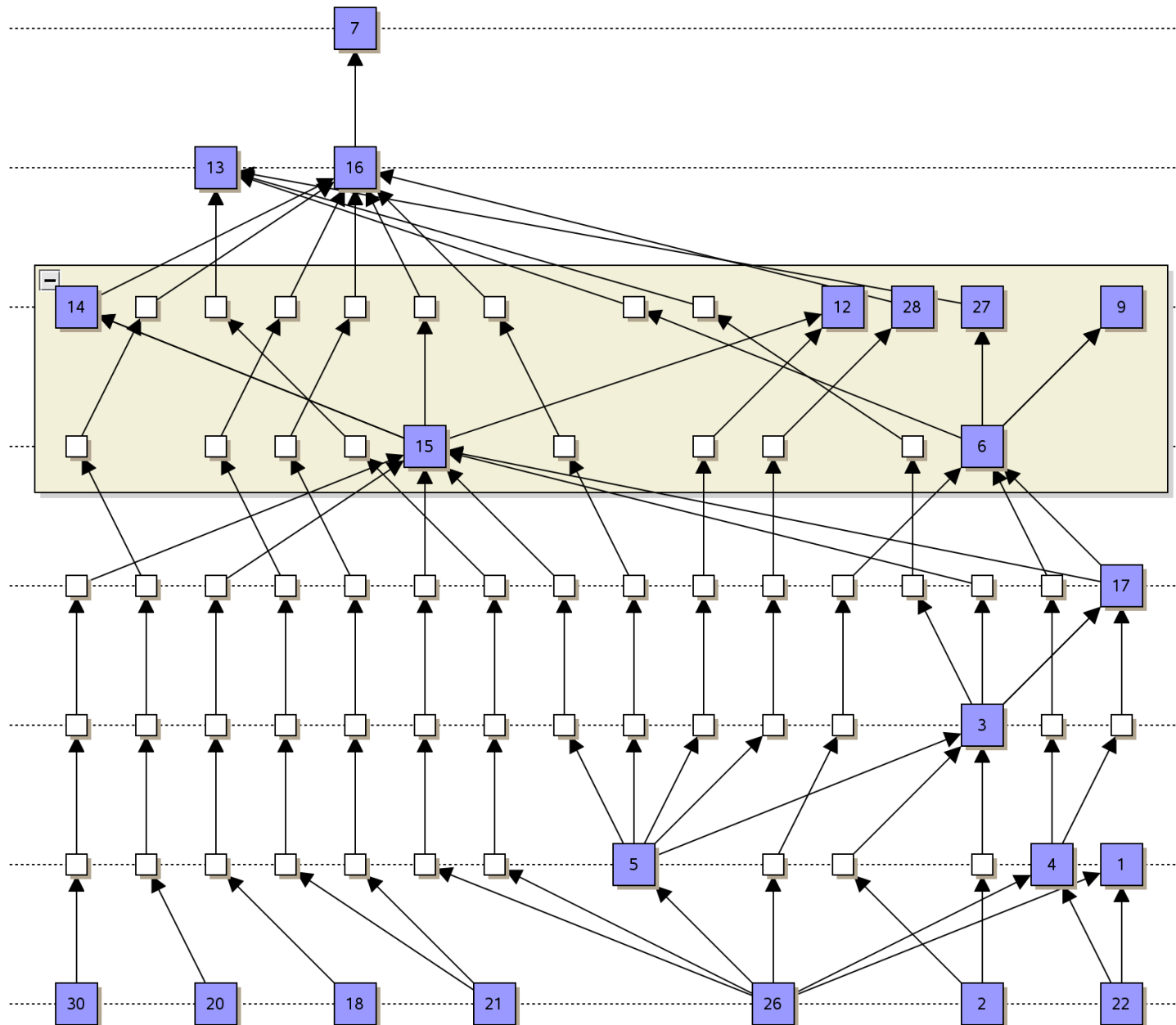


# Example



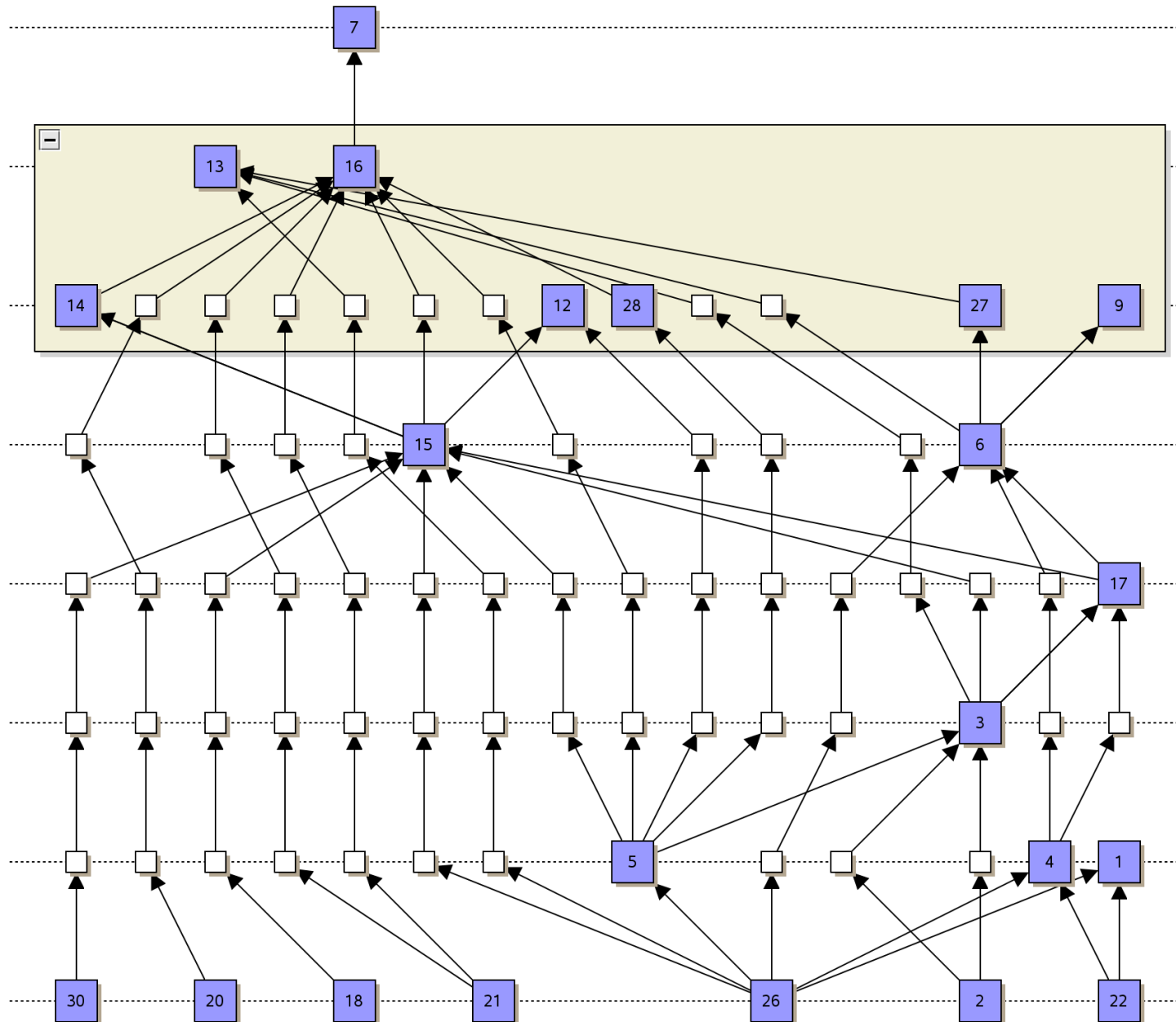
16 - 5

# Example

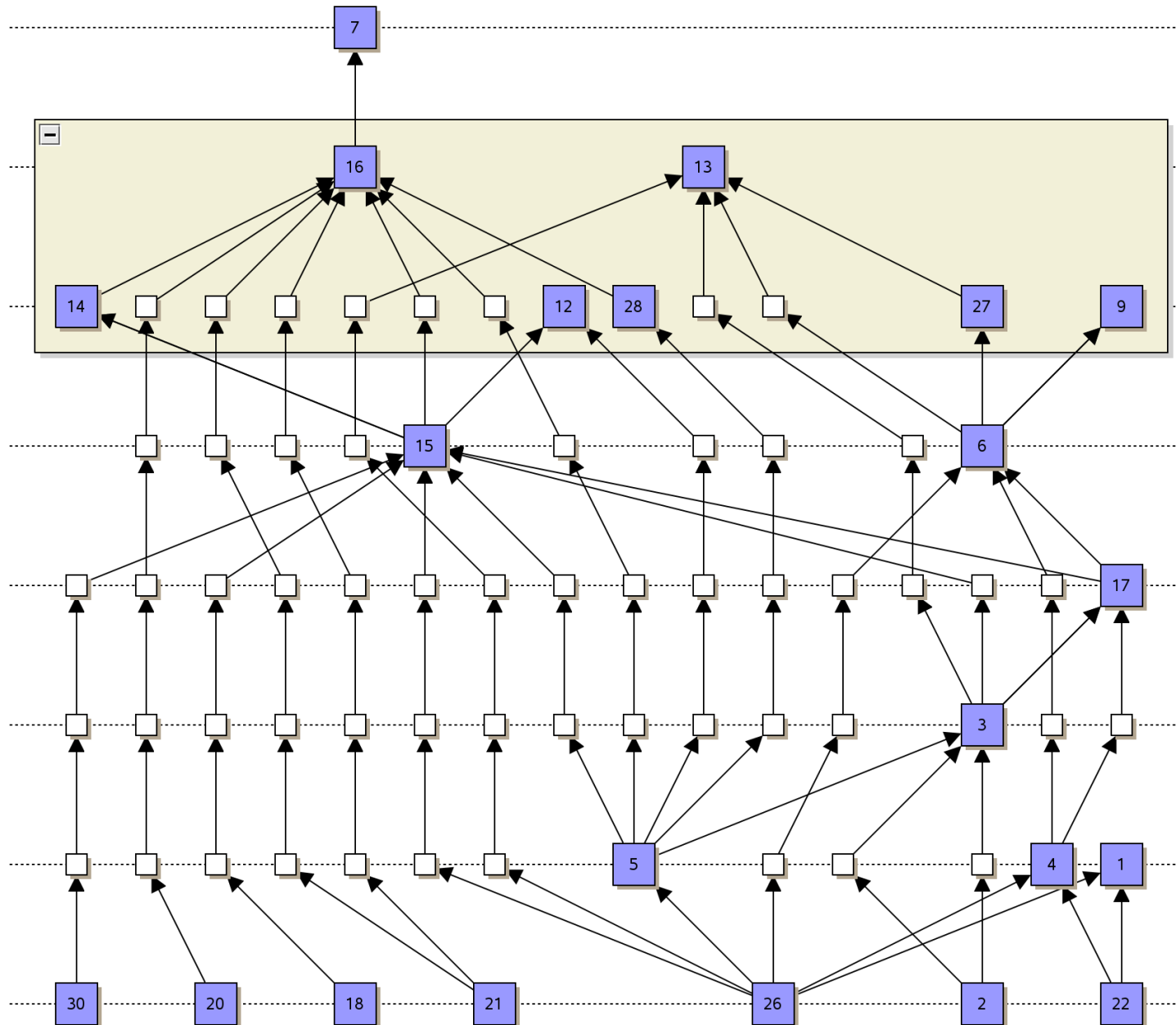


16 - 6

# Example

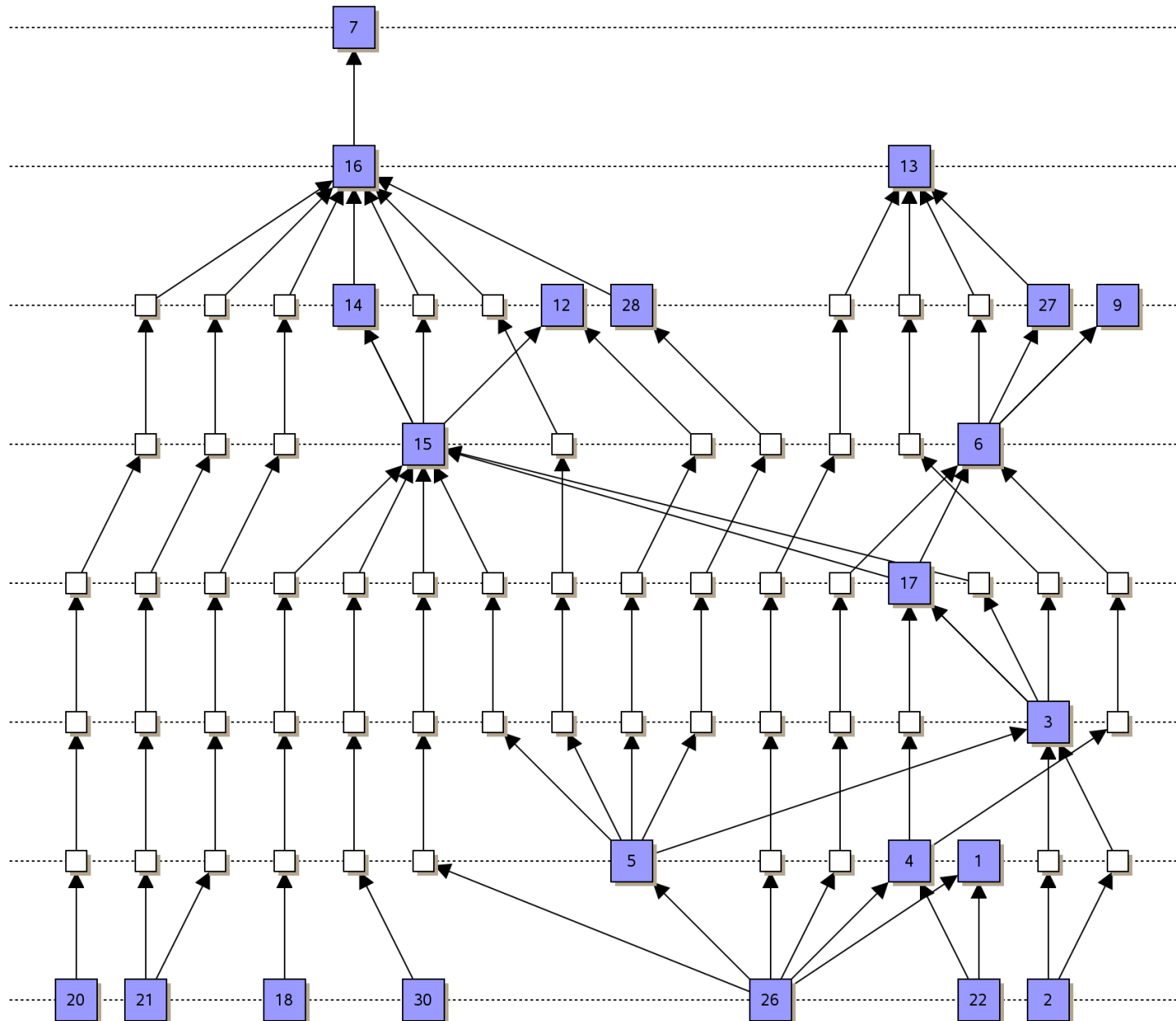


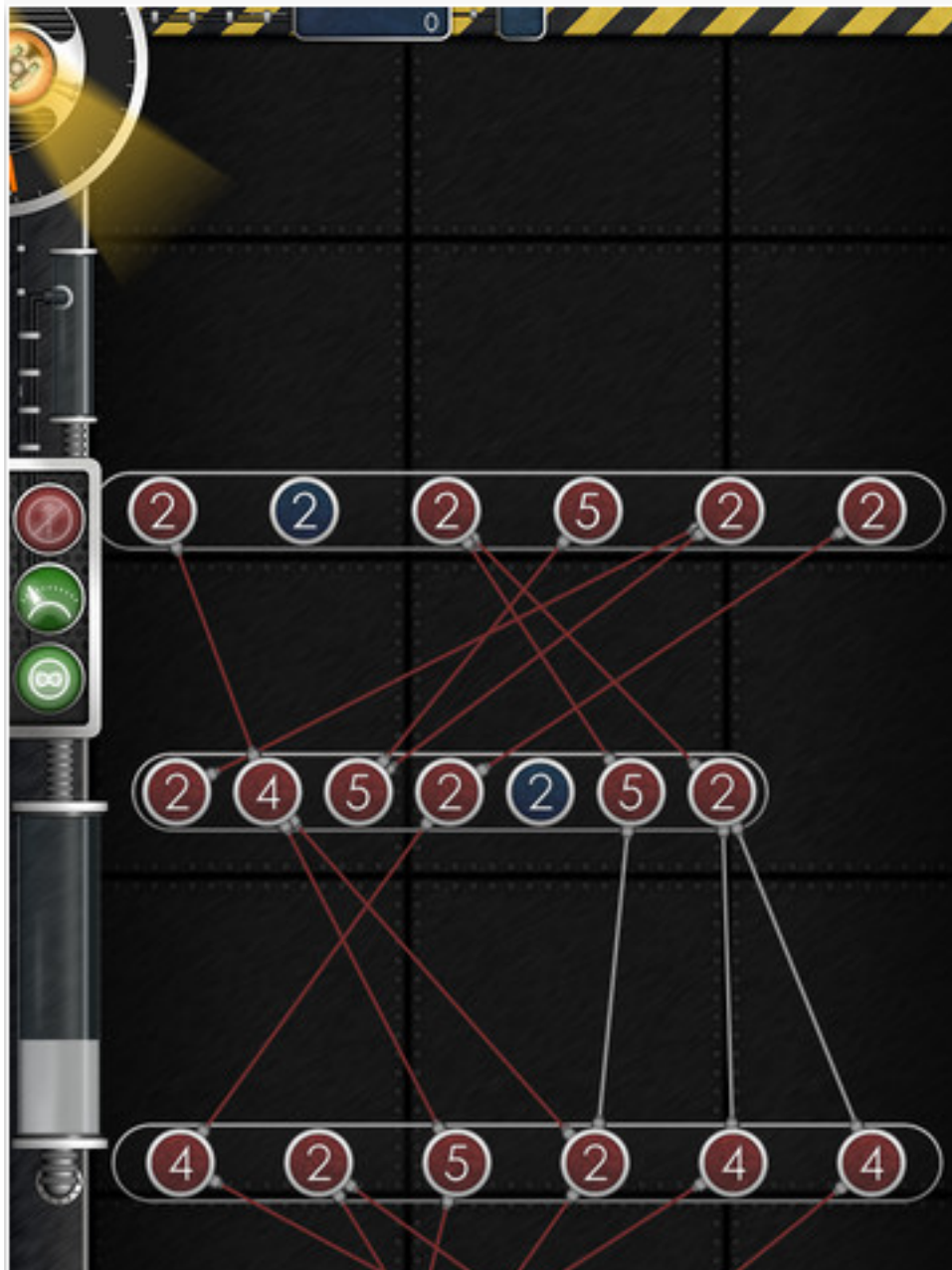
# Example



16 - 8

# Example





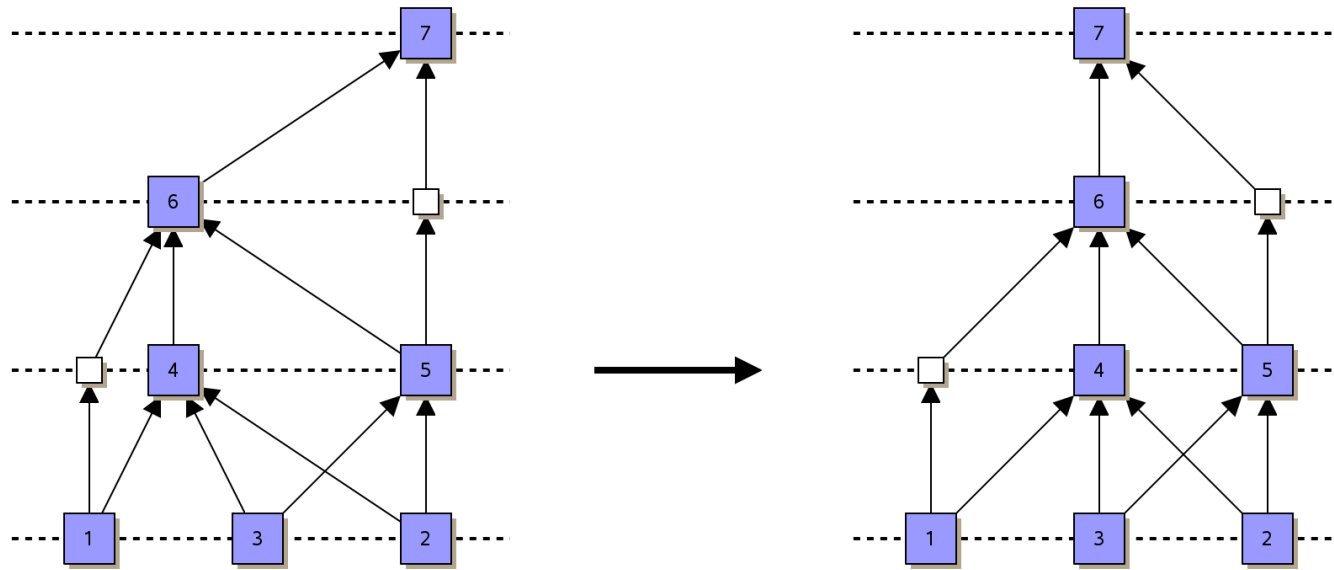
There was even an iPad game

**CrossingX** for the  
OSCM Problem!

Winner of Graph Drawing Game Contest 2012



# Step 4: Coordinate Computation



Which could be the goals?

# Steightening Edges

**Goal:** minimize deviation from a straight-line for the edges with dummy-nodes

**Idea:** use quadratic Program

- let  $p_{uv} = (u, d_1, \dots, d_k, v)$  path with  $k$  dummy nodes between  $u$  and  $v$
- let  $a_i = x(u) + \frac{i}{k+1}(x(v) - x(u))$  the  $x$ -coordinate of  $d_i$  when  $(u, v)$  is straight
- $g(p_{uv}) = \sum_{i=1}^k (x(d_i) - a_i)^2$
- minimize  $\sum_{uv \in E} g(p_{uv})$
- constraints:  $x(w) - x(z) \geq \delta$  for consecutive nodes on the same layer,  $w$  right from  $z$  ( $\delta$  distance parameter)

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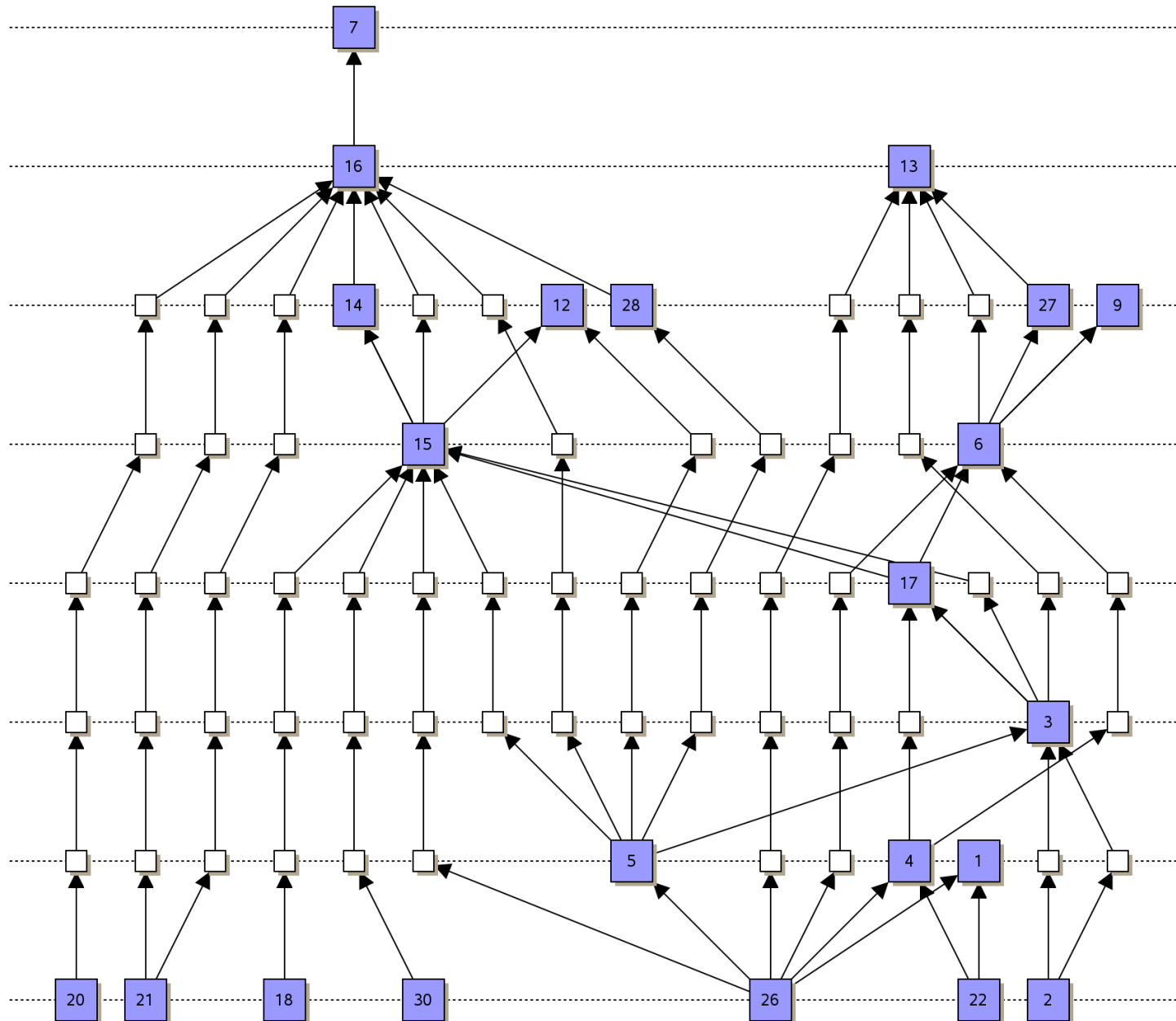
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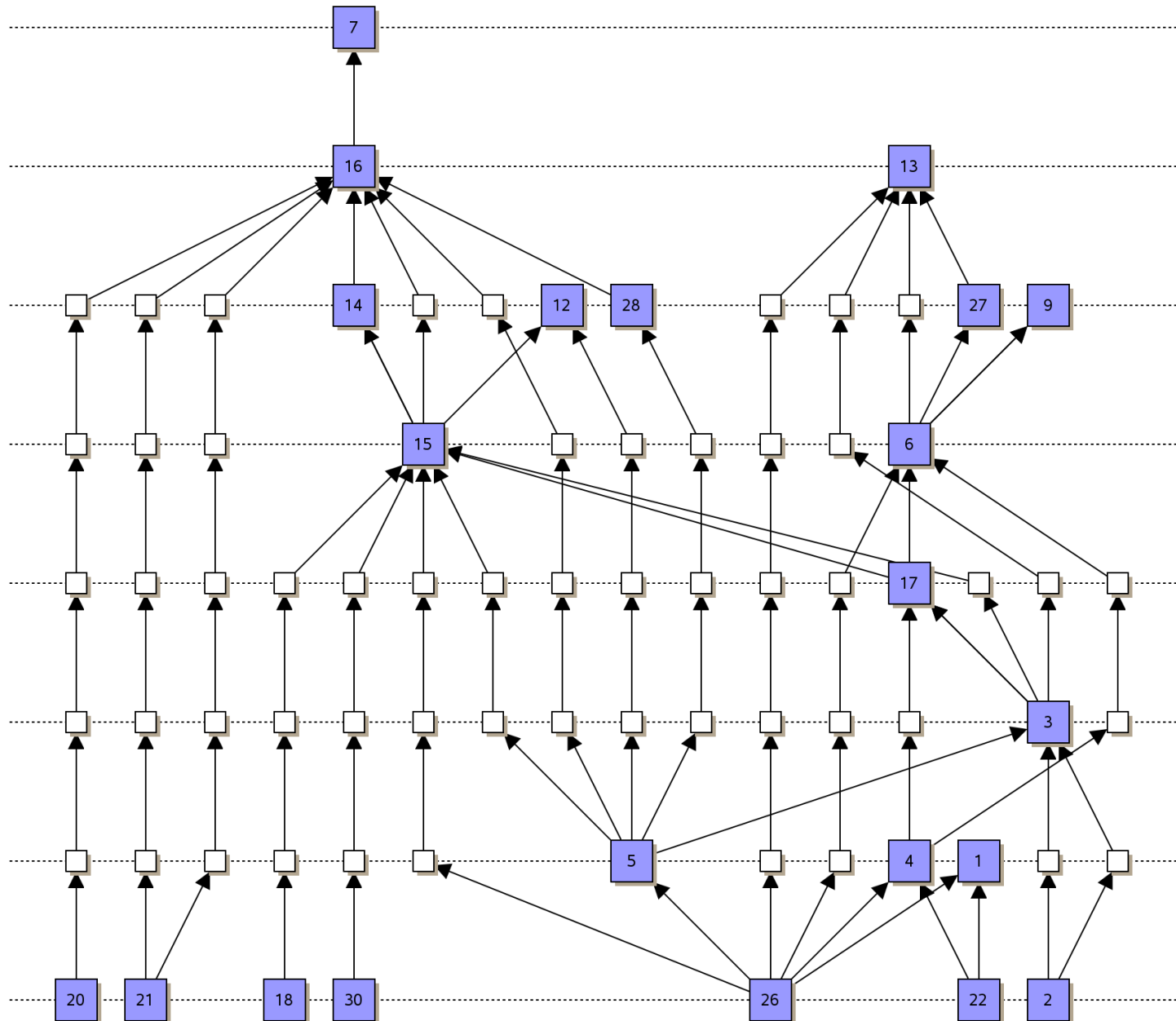
**Properties:**

- quadratic program is time-expensive
- width can be exponential
- optimization function can be adapted to optimize "verticality"

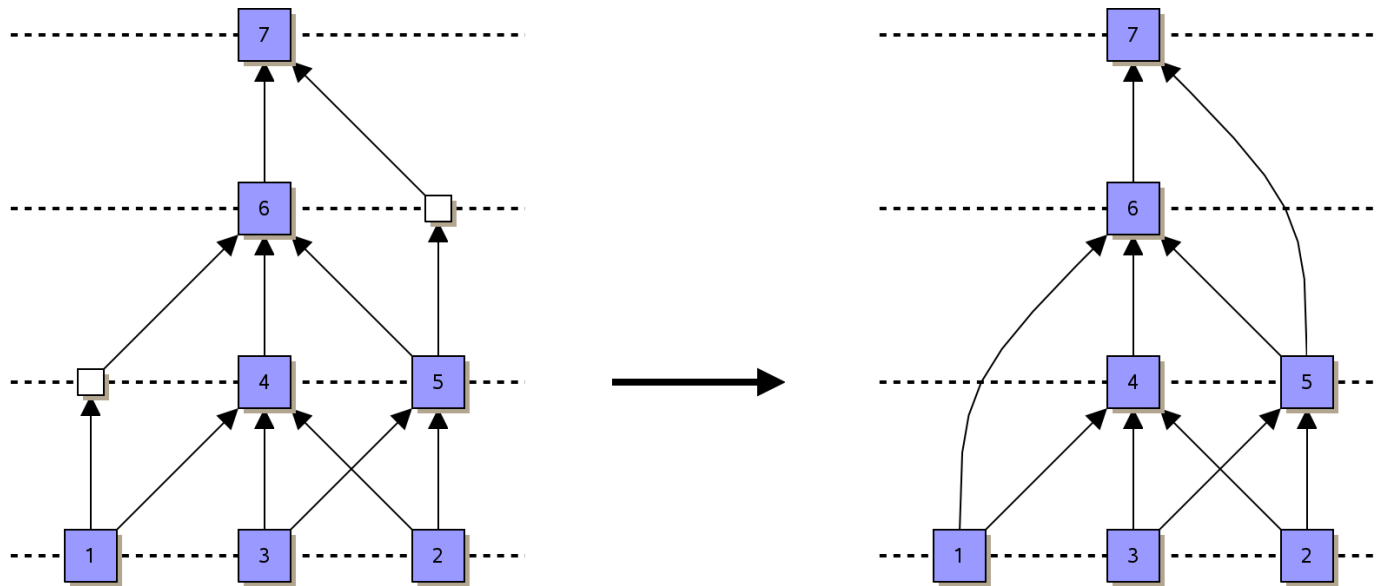
# Example



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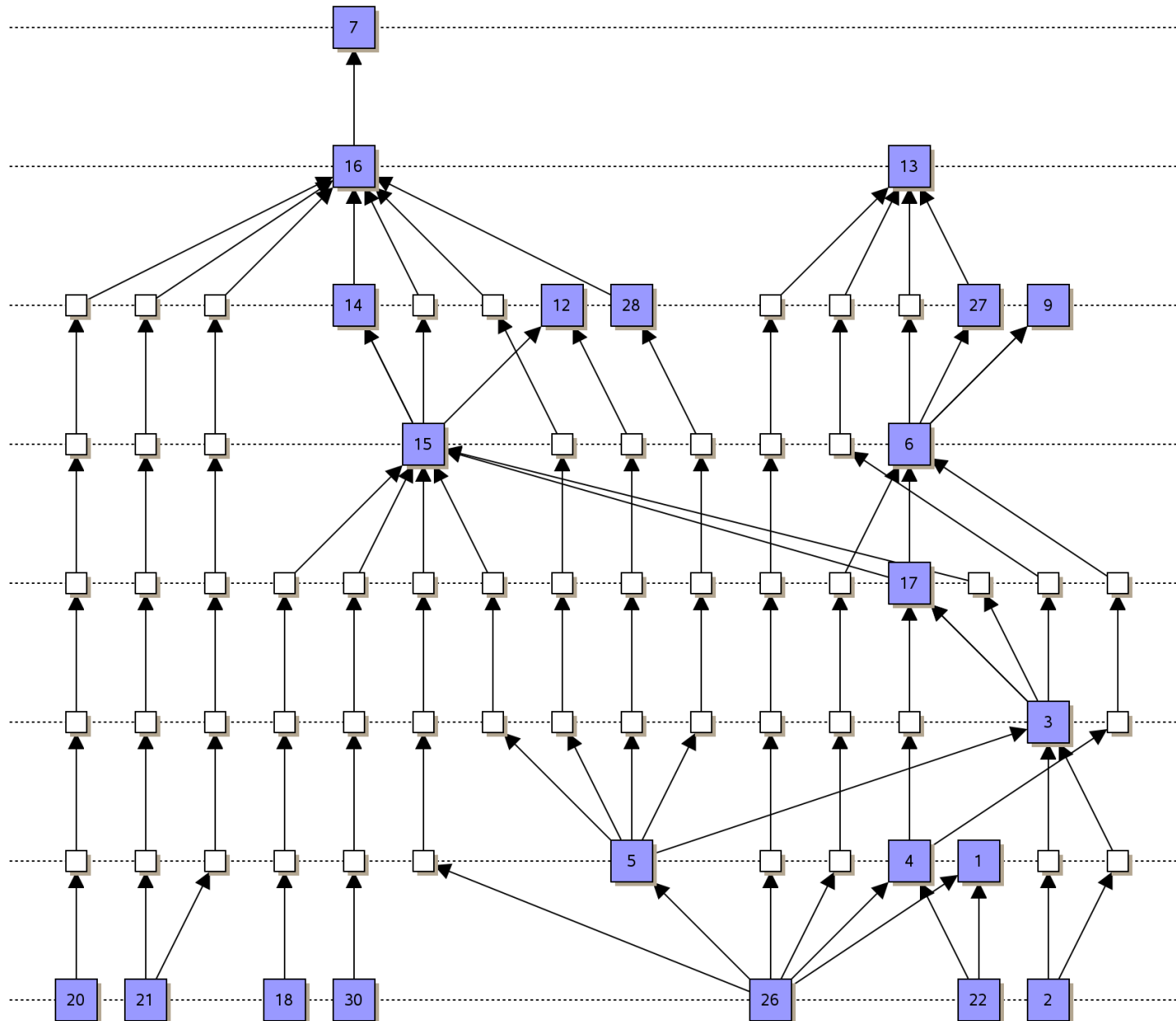


# Step 5: Drawing edges

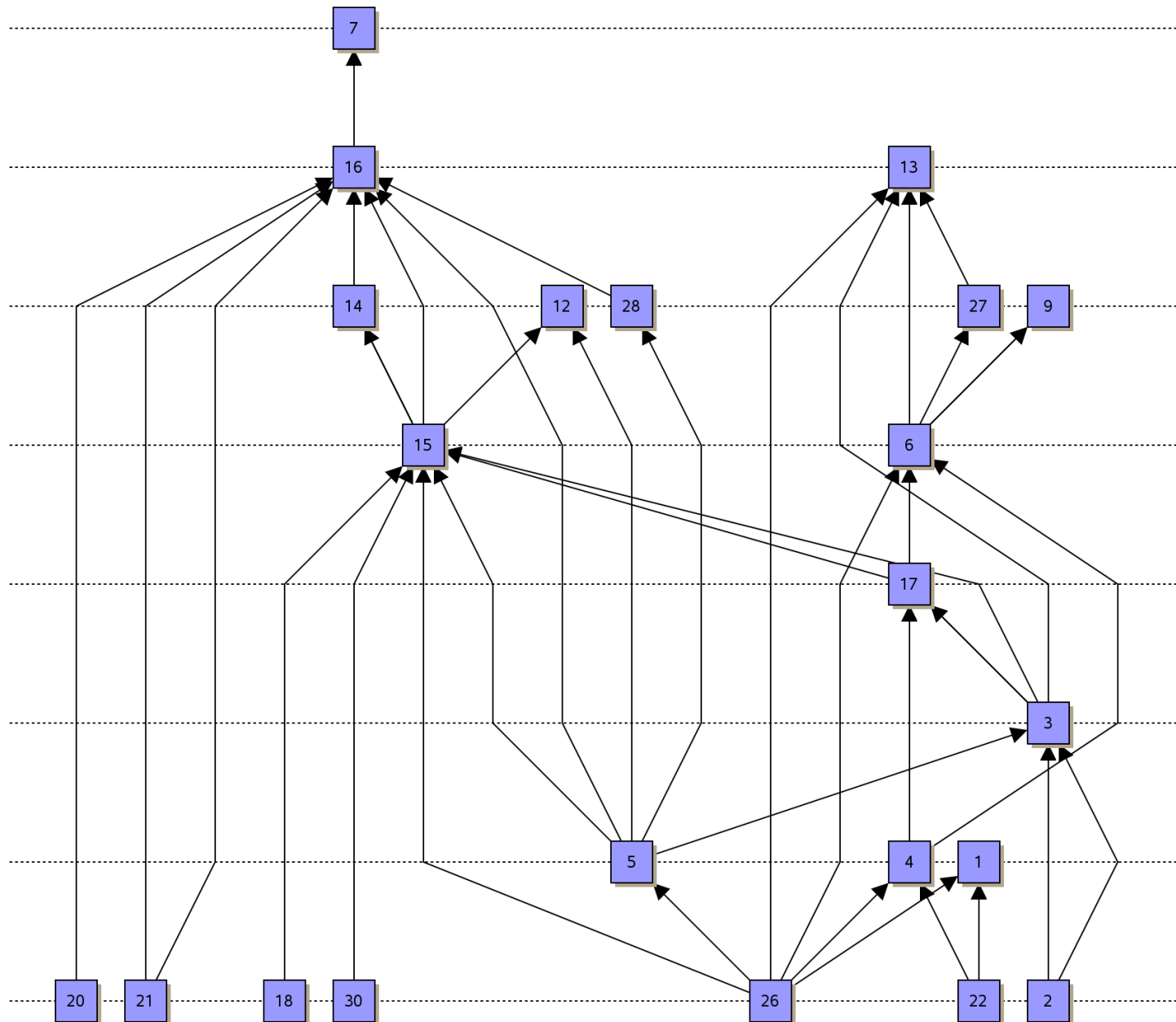


Possibility: Substitute polylines by Bézier curves

# Example

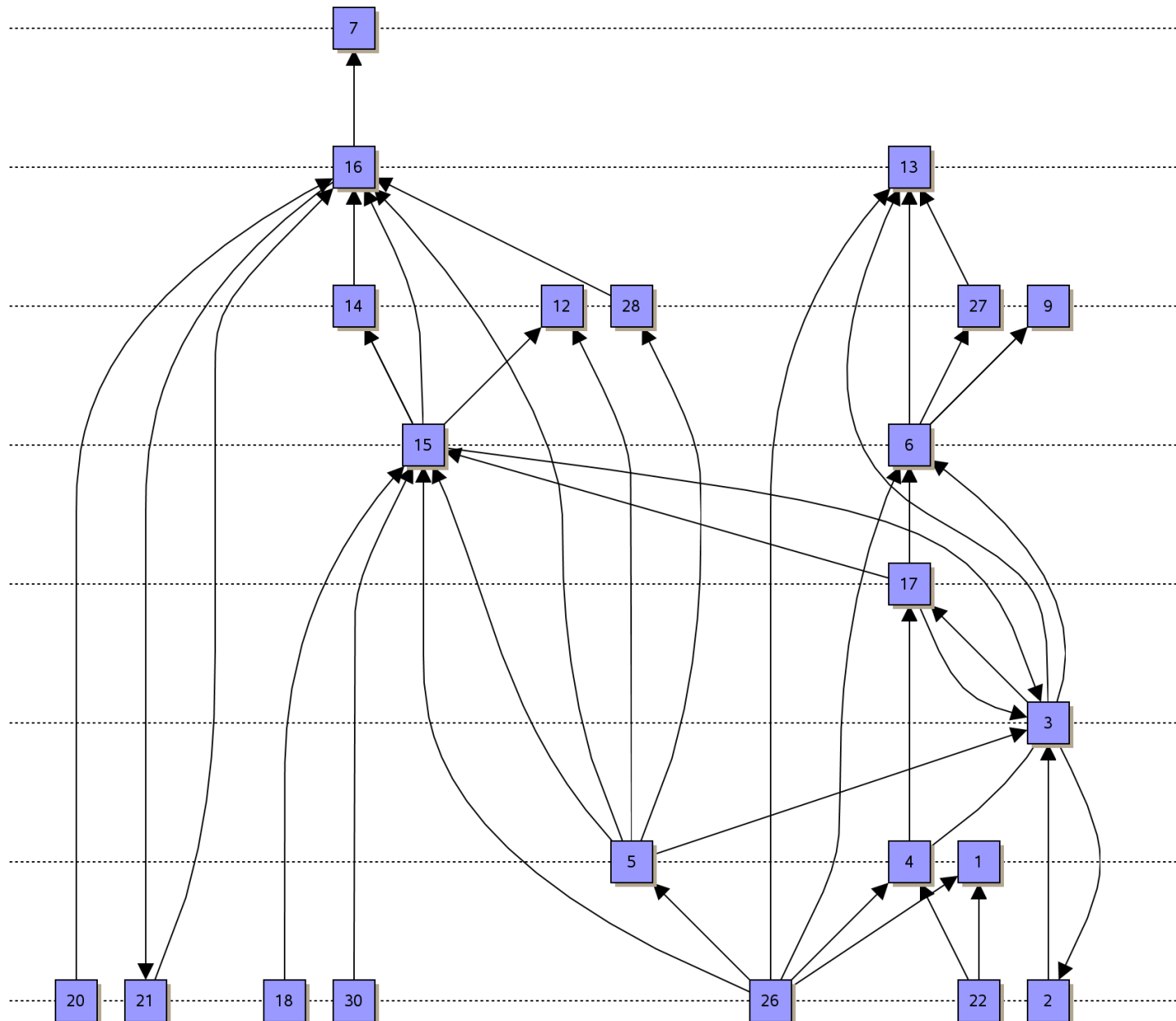


# Example

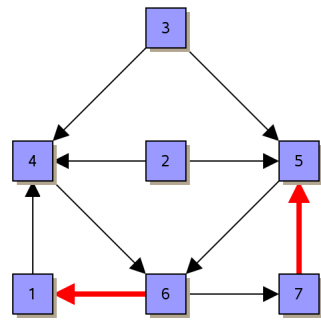




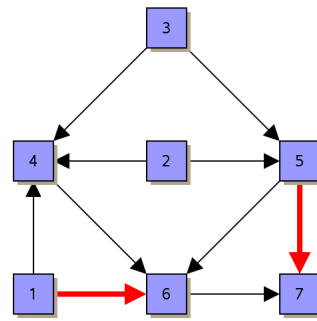
# Example



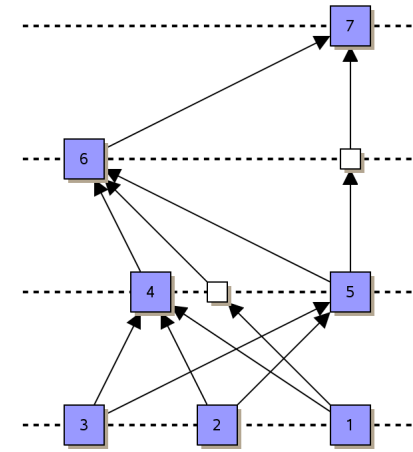
# Summary



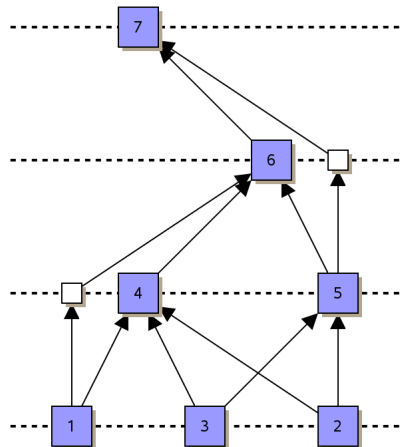
given



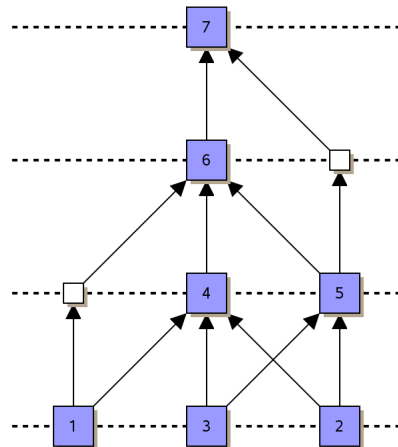
resolve cycles



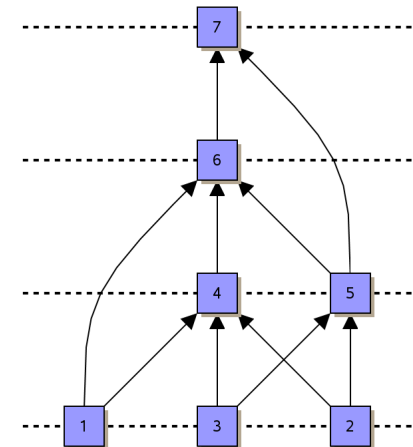
layer  
assignment



crossing minimization

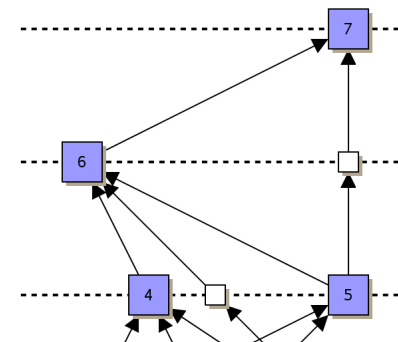
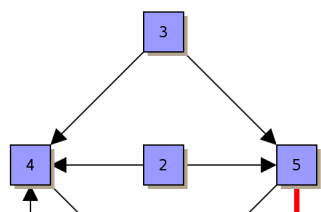
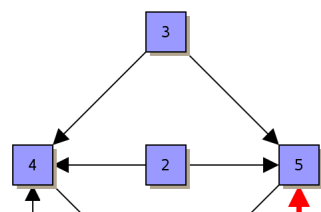


node positioning

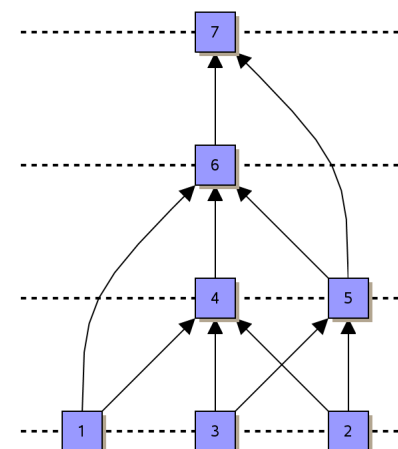
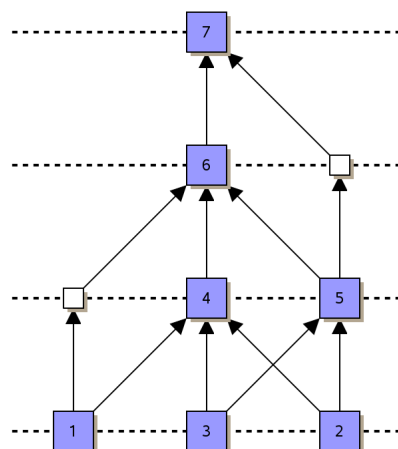
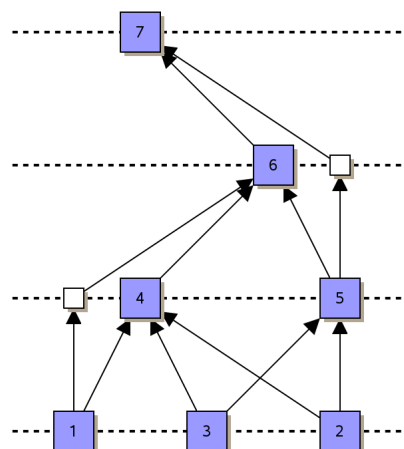


edge drawing

# Summary



- flexible Framework to draw directed graphs
- sequential optimization of various criteria
- modelling gives NP-hard problems, which can still can be solved quite well



crossing minimization

node positioning

edge drawing

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- submit your visualization by 28/2/2018