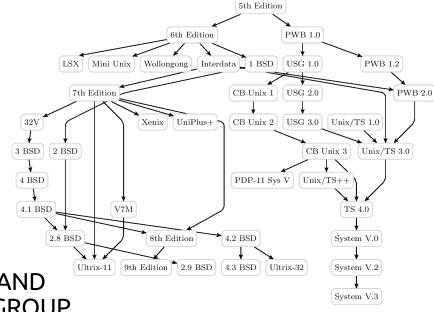
# Layered Graph Drawing

Lecture Graph Drawing Algorithms · 192.053

Martin Nöllenburg 15.05.2018





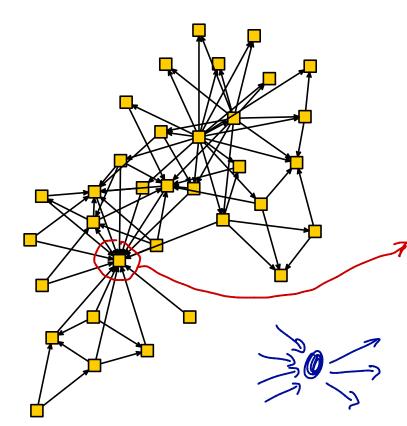
# Drawing Directed Graphs



Previously we studied mostly undirected graphs except for trees and series-parallel graphs. What if our input graph is directed but neither a tree nor series-parallel?

#### What is a suitable set of constraints and aesthetic criteria?

Assumptions: simple, directed graph



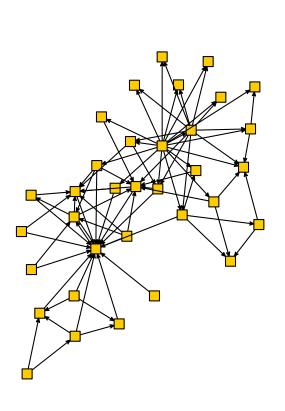
- e straight edges
- · New wossings
- · læge angles
- general edge direction, e.g.
- · identify and show structures like cycles...

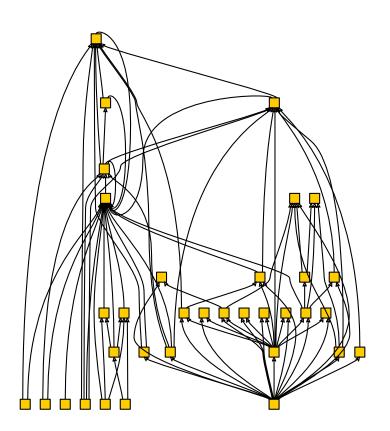
# Layered Graph Layout



**Input:** directed graph D = (V, A)

**Output:** drawing of D that emphasizes its hierarchical structure





# Layered Graph Layout



**Input:** directed graph D = (V, A)

Output: drawing of D that emphasizes its hierarchical structure

#### **Criteria:**

- many edges pointing upward (or some other direction)
- ideally short, straight and vertical edges
- vertices placed on (few) horizontal layers
- few edge crossings
- evenly distributed vertices

# Layered Graph Layout



**Input:** directed graph D = (V, A)

Output: drawing of D that emphasizes its hierarchical structure

#### **Criteria:**

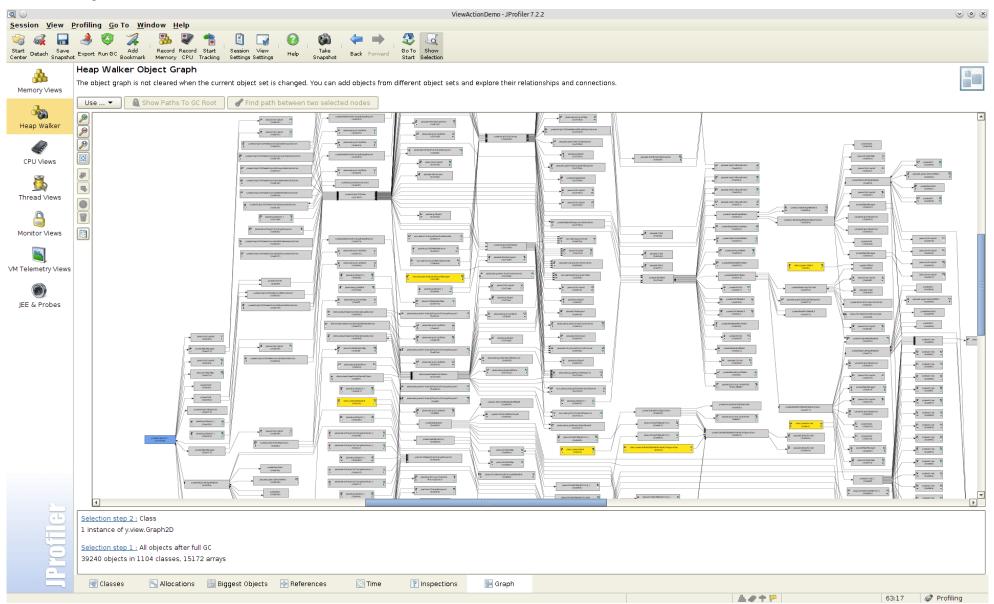
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# Examples

# acılıı

# Java profiler

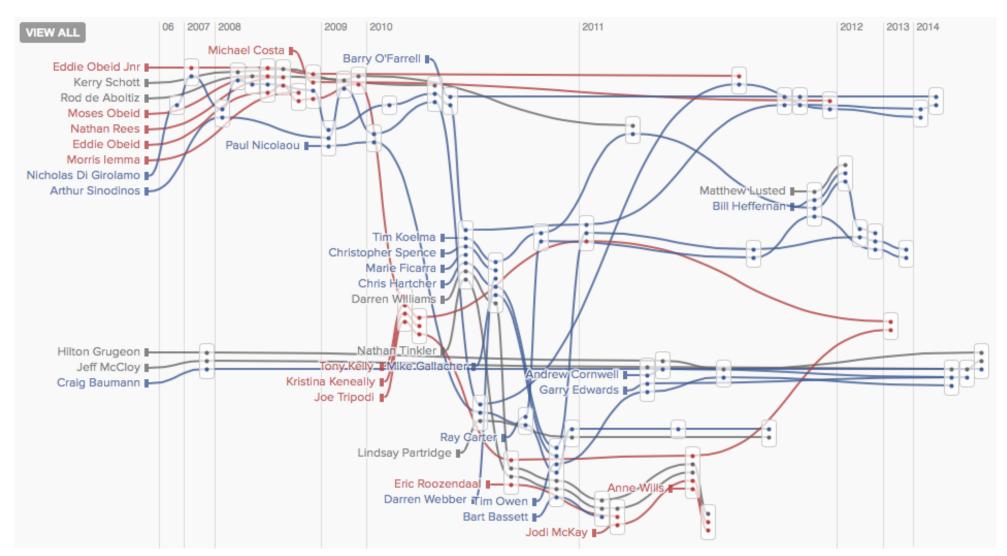


#### Java profiler JProfiler via yFiles

# Examples

# acılıı

## Storyline layout

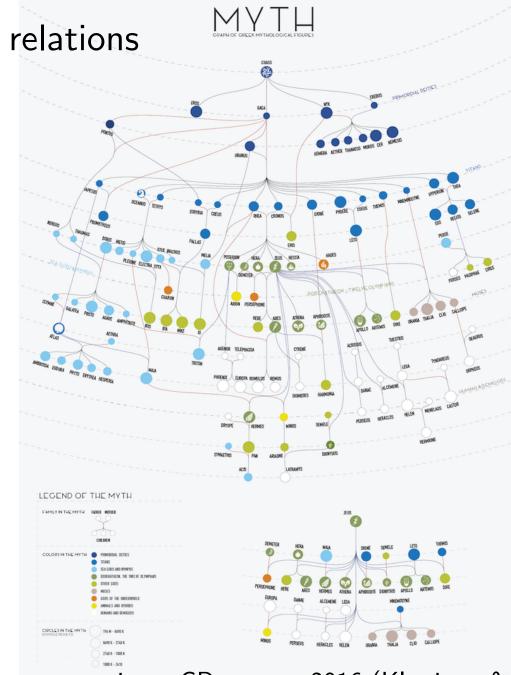


Politics data visualization from ABC news, Australia

# Examples

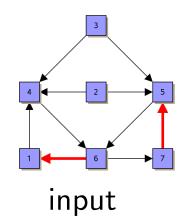
acilii

Greek mythology family relations

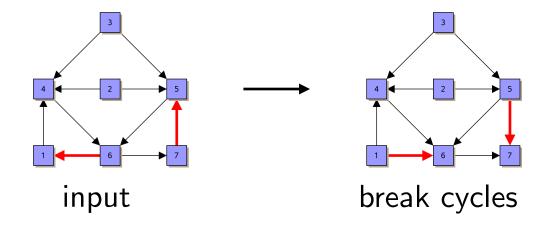


winner GD contest 2016 (Klawitter & Mchedlidze)

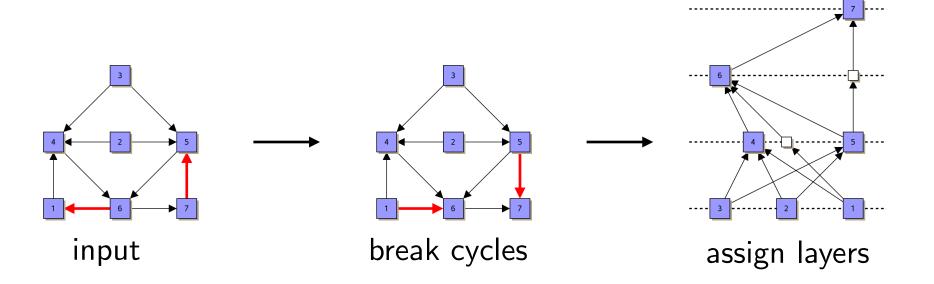




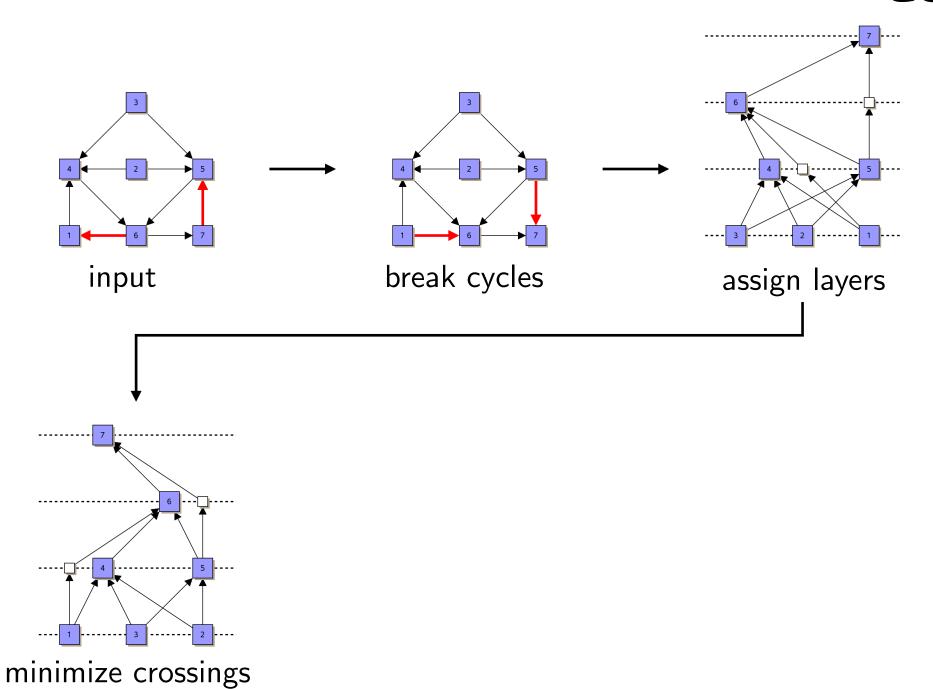




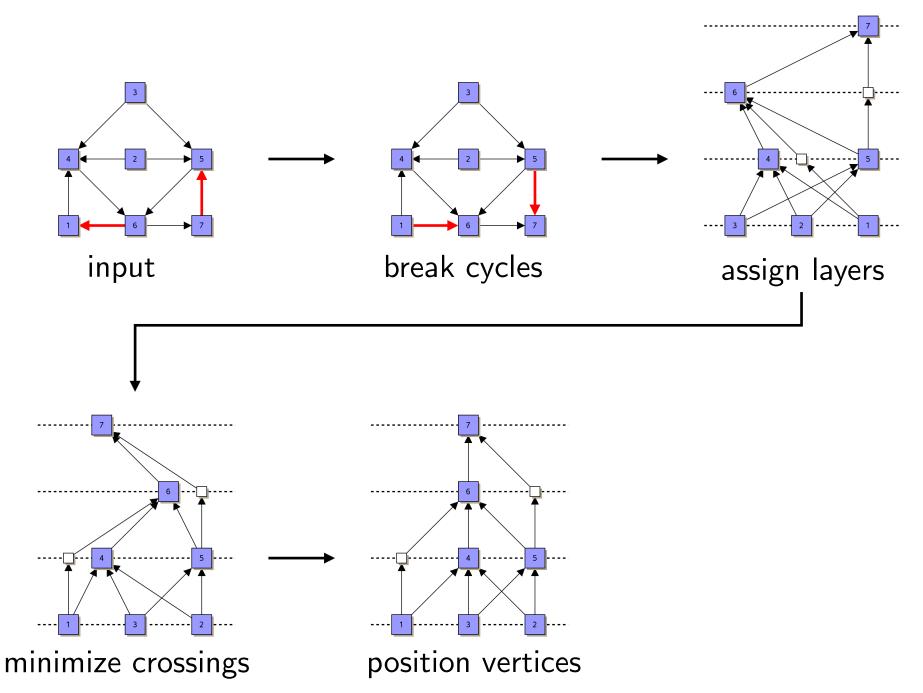




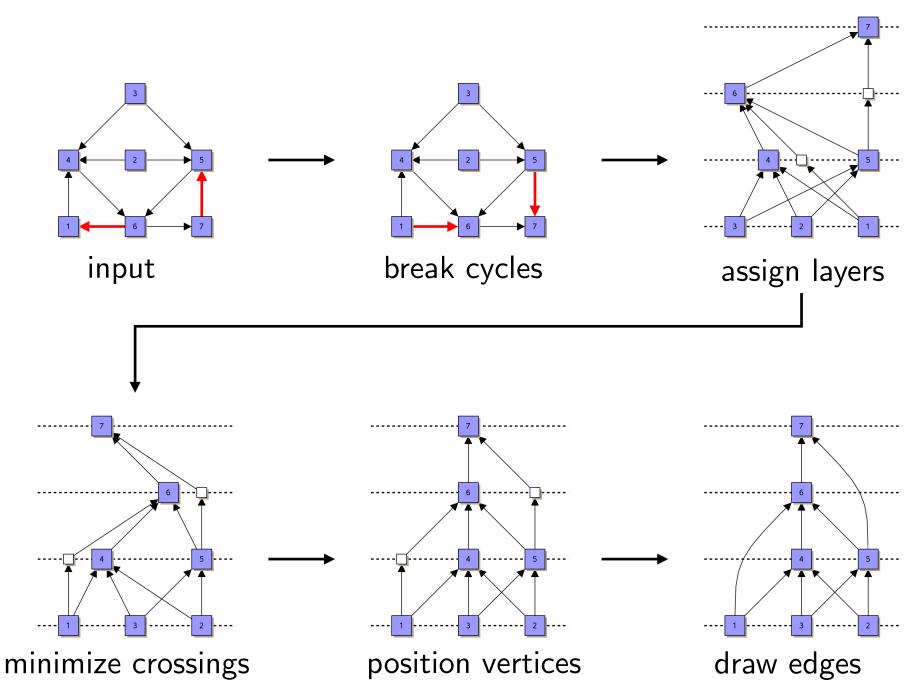




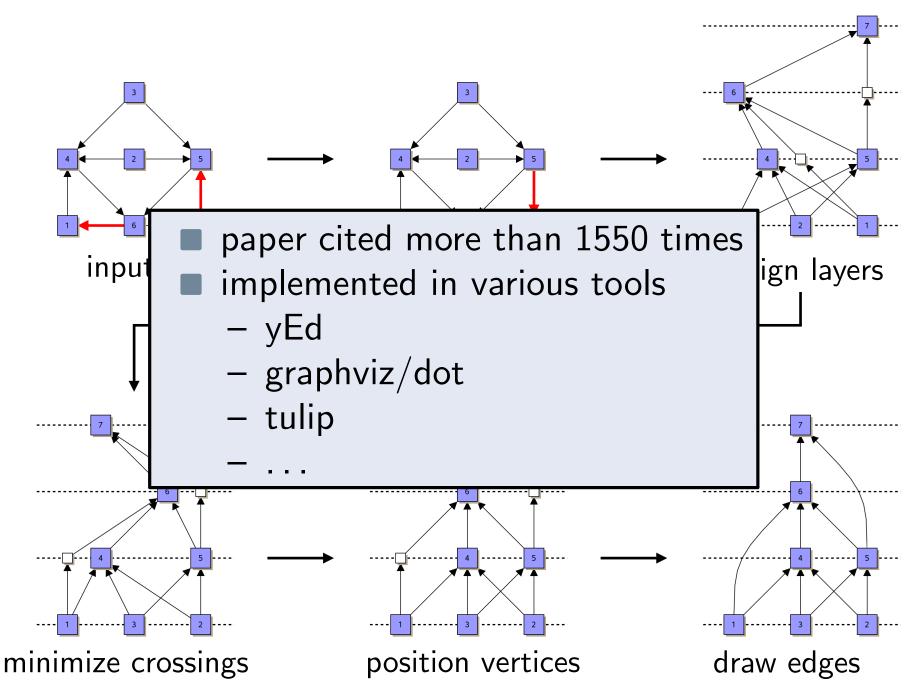




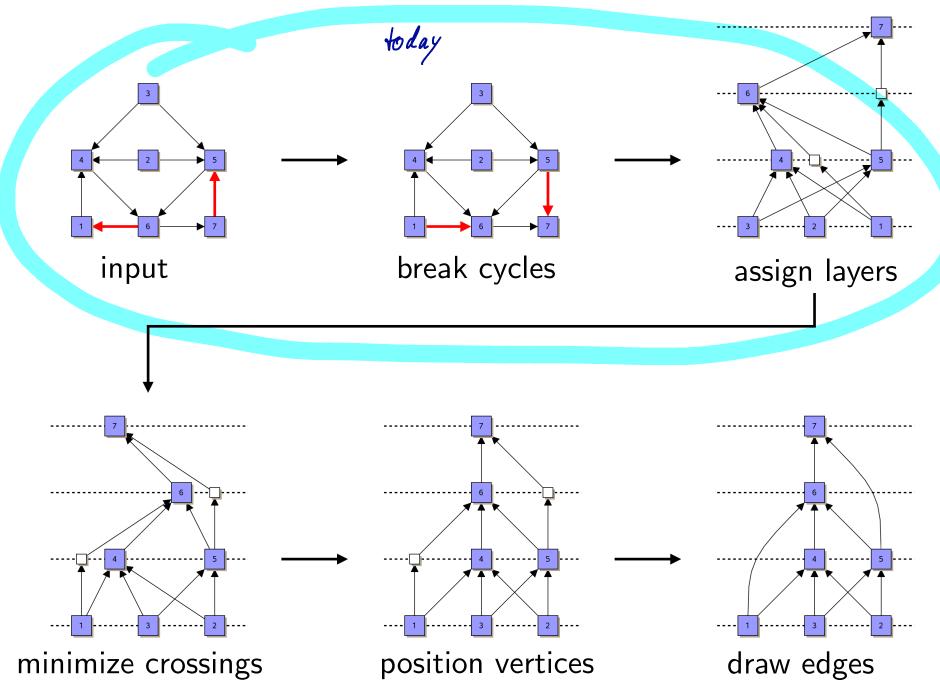






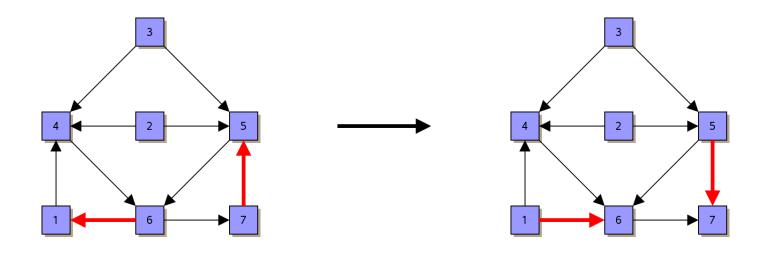






Step 1: Break Cycles





What would you do?



**Idea:** ■ find maximum acyclic subgraph

reverse the directions of the other edges



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reverse the directions of the other edges

### Maximum Acyclic Subgraph

input: directed graph D = (V, A)  $A' \subseteq A$ 

**output:** acyclic subgraph D' = (V, A') with |A'| maximum



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**output:**  $A_f \subset A$ , s.t.  $D_f = (V, A \setminus A_f)$  acyclic and  $|A_f|$ 

minimum



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### Minimum Feedback Set (FS)

**input:** directed graph D = (V, A)

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 $|A_f|$  minimum



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### All three problems are NP-hard!

## Heuristic 1 (Berger, Shor 1990)



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$$A' := \emptyset;$$

#### foreach $v \in V$ do

if 
$$|N^{\rightarrow}(v)| \ge |N^{\leftarrow}(v)|$$
 then  $|A' := A' \cup N^{\rightarrow}(v);$ 

#### else

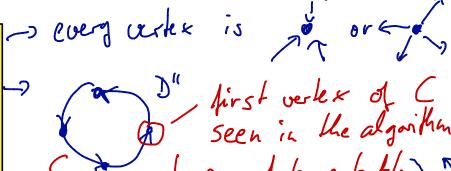
$$A' := A' \cup N^{\leftarrow}(v);$$

remove v and N(v) from D

return 
$$D' = (V, A')$$

 $N^{\to}(v) := \{(v, u) : (v, u) \in A\}$  $N^{\leftarrow}(v) := \{(u,v): (u,v) \in A\}$  $N(v) := N^{\rightarrow}(v) \cup N^{\leftarrow}(v)$ 

- lacksquare D' is a DAG (directed acyclic graph)
- $\blacksquare$   $A \setminus A'$  is a feedback arc set (not necessarily minimum)
- Why are there no cycles in D'?
- Is  $D'' = (V, A' \cup rev(A \setminus A'))$  acyclic?
- What is the running time?
- What do we know about |A'|?



Martin Nöllenburg · Graph Drawing Algorithms: Layered Graph Drawing

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- lacksquare D' is a DAG (directed acyclic graph)
- $\blacksquare$   $A \setminus A'$  is a feedback arc set (not necessarily minimum)
- lacksquare running time O(|V|+|A|)
- $\blacksquare |A'| \ge |A|/2$

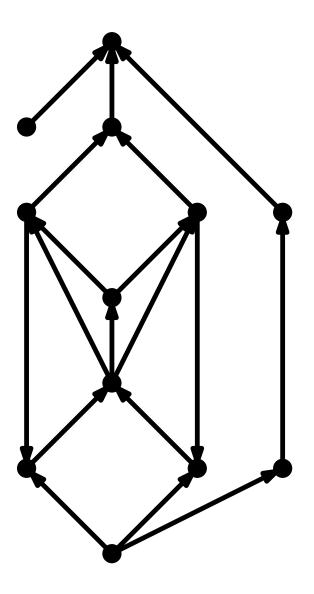


```
\mathbf{1} \ A' := \emptyset;
```

2 while  $V \neq \emptyset$  do

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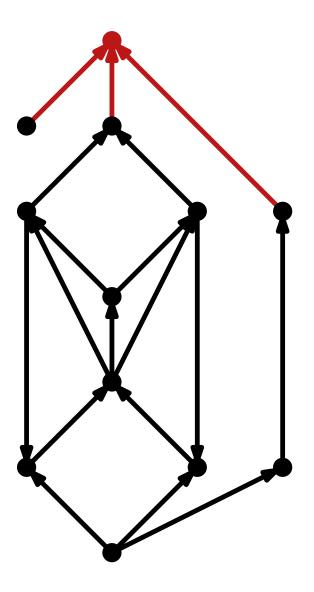
remove v and  $N^{\leftarrow}(v)$ :  $\{V, n, m\}_{\text{sink}}$ 





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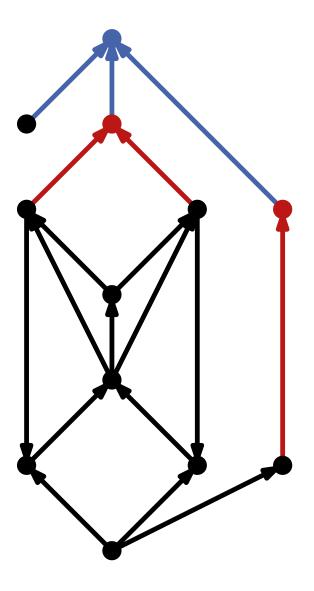
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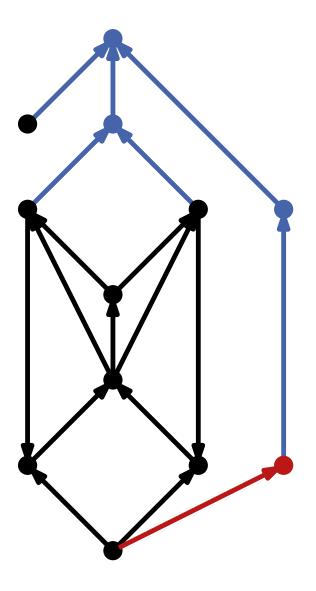
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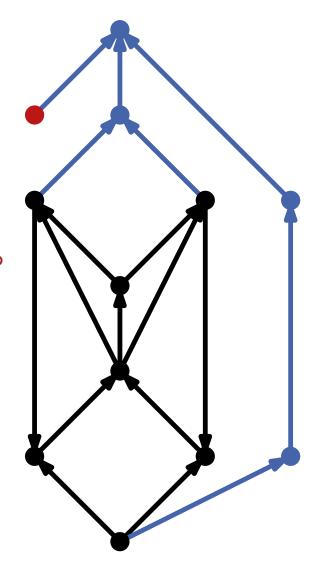
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remove all isolated vertices from V:  $\{V, n, m\}_{iso}$ 





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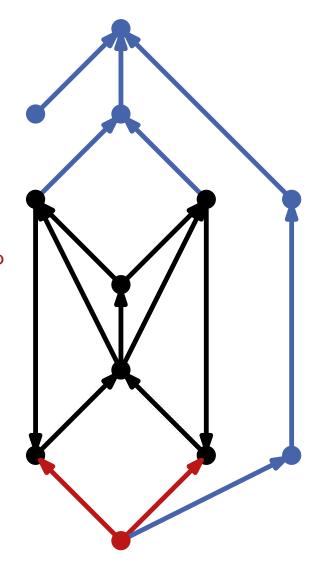
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while V contains a source v do

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6



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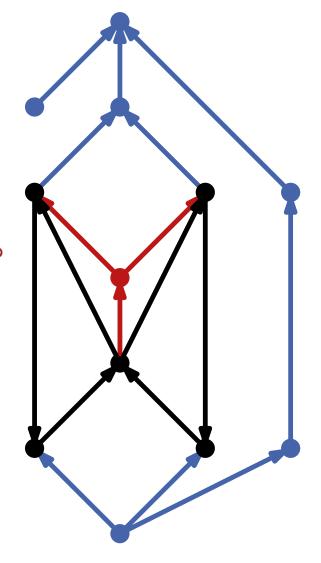
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6

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**10** 

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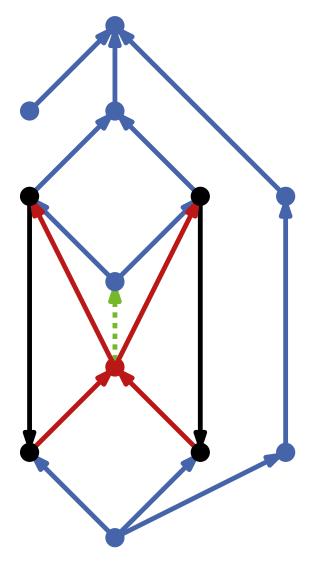
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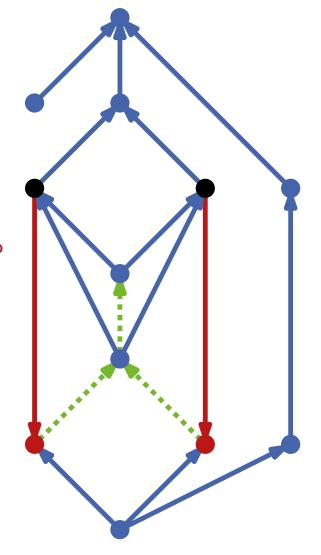
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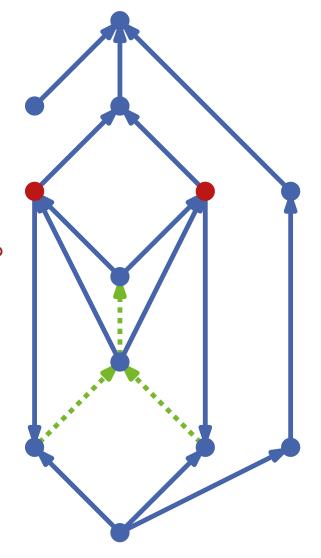
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$$v \in V$$
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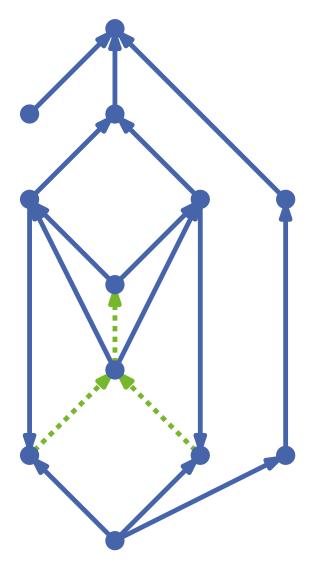
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#### Heuristic 2 (Eades, Lin, Smyth 1993)



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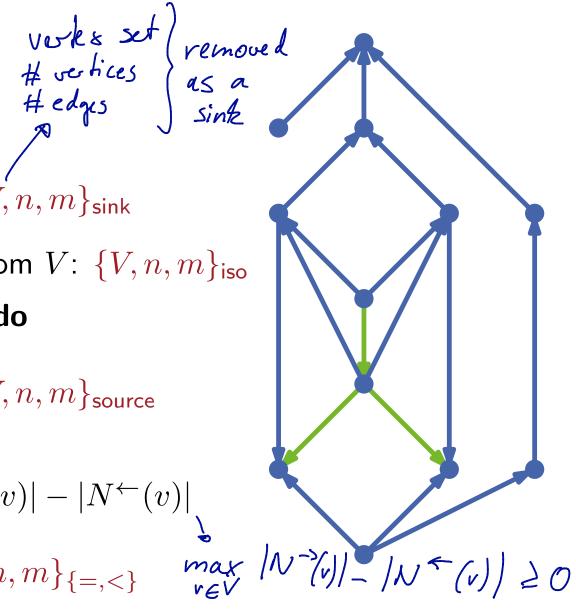
remove v and  $N^{\rightarrow}(v)$ :  $\{V, n, m\}_{\text{source}}$ 

#### if $V \neq \emptyset$ then

let  $v \in V$  maximize  $|N^{\rightarrow}(v)| - |N^{\leftarrow}(v)|$ 

 $A' \leftarrow A' \cup N^{\rightarrow}(v)$ 

 $\text{remove } v \text{ and } N(v) \colon \{V, n, m\}_{\{=,<\}} \qquad \max_{v \in V} |V^-(v)| - |V^-(v)| \geq 0$ 



Observation.

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**Theorem:** Let D = (V, A) be a connected, directed graph without 2-cycles. Heuristic 2 computes an edge set A'with  $|A'| \ge |A|/2 + |V|/6$  in O(|A|) time.

- none in the beginning - line 13:

- line 9:

no! because a would have been a sink before

no! same asgrument

yes, when removing (u,v)

=) nico - mank



**Theorem:** Let D = (V, A) be a connected, directed graph without 2-cycles. Heuristic 2 computes an edge set A'with  $|A'| \ge |A|/2 + |V|/6$  in O(|A|) time.

. after removing one 
$$v \in V_{-}$$
 there is a velex  $u$  with  $|N^{-}(u)| - |N^{-}(u)| > 0$   
onext removed we kex is in  $V_{\text{sink}} \cup V_{\text{source}} \cup V_{\text{c}}$ 



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how many edges are in A?

Nor 
$$u \in V_2$$
:  $\frac{deg(u)}{2}$ 

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Nor



**Theorem:** Let D=(V,A) be a connected, directed graph without 2-cycles. Heuristic 2 computes an edge set A' with  $|A'| \geq |A|/2 + |V|/6$  in O(|A|) time.

as doubly finhed hist running time define backets B\_n+3,..., Bo,..., Bn-3 inte Bi o put vertices with  $|N^{-2}(v)| - |N^{-2}(v)| = i$ o sources, sinks, isolated into their own sets initialize Mosets in O(1A1) time · each step takes  $O(\deg(v))$  [includes update of neighbors and shift to next or previous bucket]



**Theorem:** Let D=(V,A) be a connected, directed graph without 2-cycles. Heuristic 2 computes an edge set A' with  $|A'| \geq |A|/2 + |V|/6$  in O(|A|) time.

#### **Further techniques:**

$$\qquad |A'| \geq |A| \left( 1/2 + \Omega \left( \frac{1}{\sqrt{\deg_{\max}(D)}} \right) \right) \text{ (Berger, Shor 1990)}$$

exact solution using integer linear programming and branch-and-cut (Grötschel et al. 1985)



**Theorem:** Let D = (V, A) be a connected, directed graph without 2-cycles. Heuristic 2 computes an edge set A'with |A'| > |A|/2 + |V|/6 in O(|A|) time.

#### **Further techniques:**

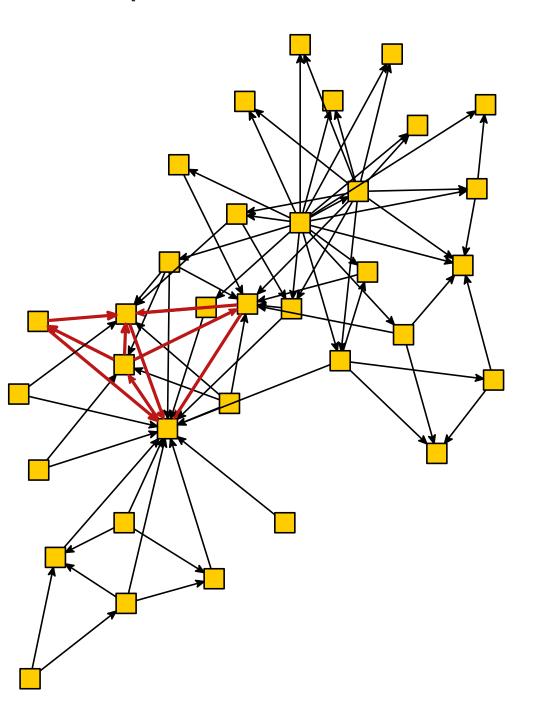
 $|A'| \ge |A| \left(1/2 + \Omega\left(\frac{1}{\sqrt{\deg_{\max}(D)}}\right)\right) \text{ (Berger, Shor 1990)}$  exact solution using integer linear programming and

branch-and-c/t (Grötschel et al. 1985)

For  $|A| \in O(|V|)$  Heuristic 2 is at least as good.

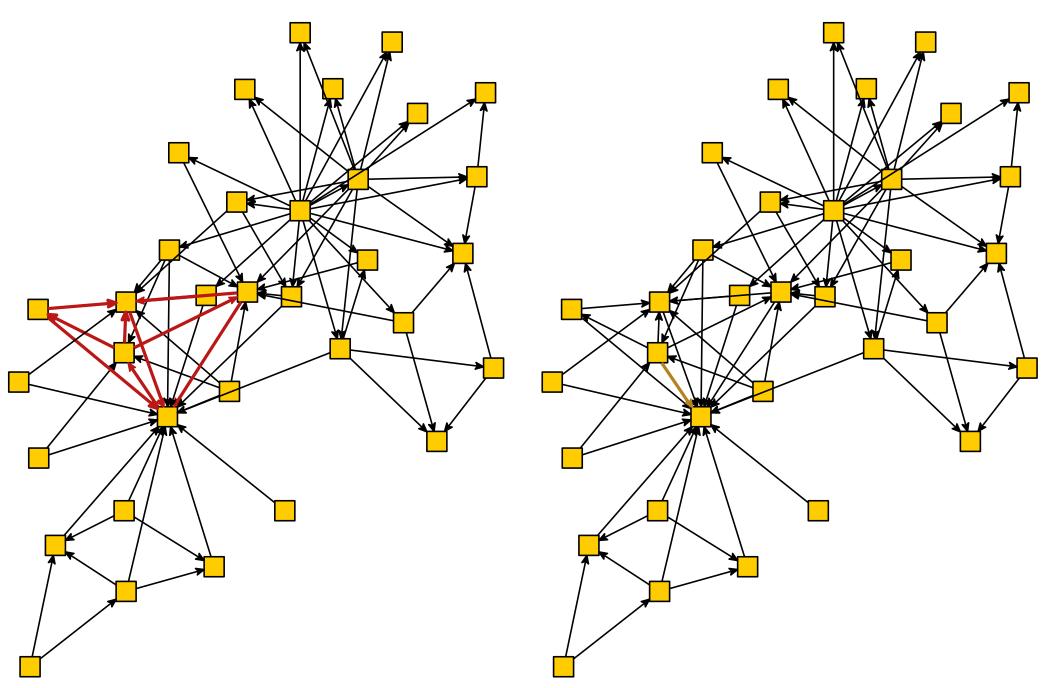
# Example





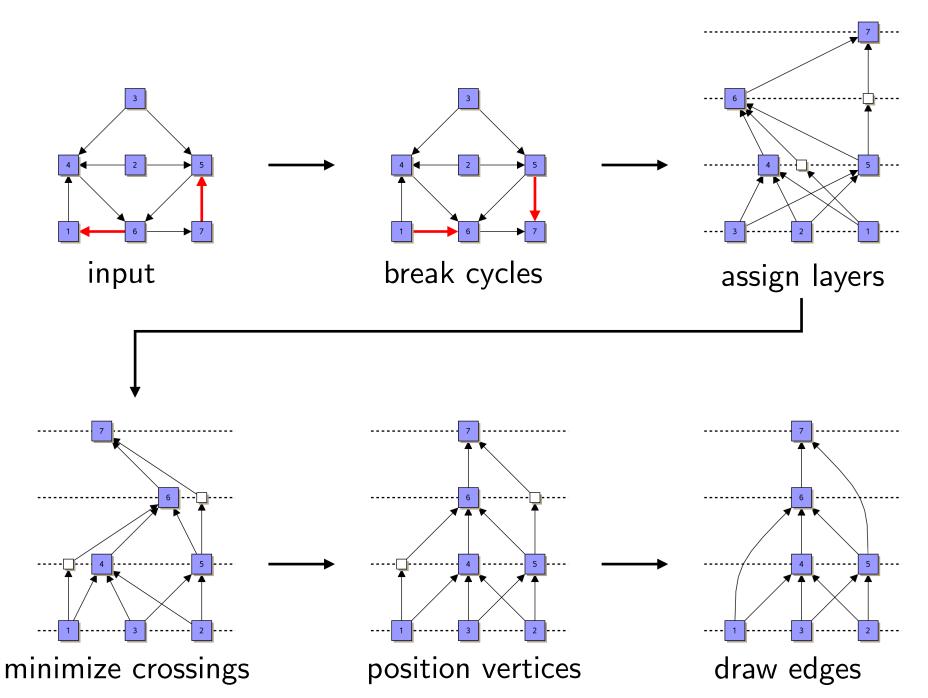
# Example





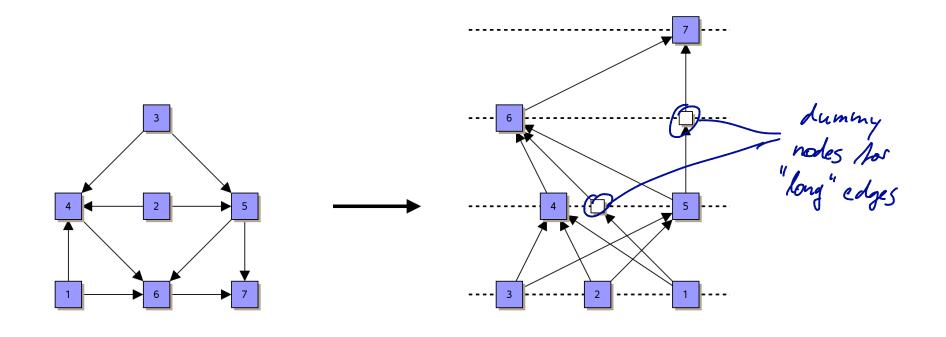
#### Overview





Step 2: Assign Layers





What would you do?

-> topological sorting

### Layer Assignment



**Input:** directed acyclic graph D = (V, A)

**Output:** partition of V into disjoint subsets (layers)  $L_1, \ldots, L_h$ 

s.t.  $(u,v) \in A, u \in L_i, v \in L_j \Rightarrow i < j$ 

**Define:** y-Coordinate  $y(u) = i \Leftrightarrow u \in L_i$ 

### Layer Assignment



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**Define:** y-Coordinate  $y(u) = i \Leftrightarrow u \in L_i$ 

#### Some optimization criteria:

- $\blacksquare$  minimize the number h of layers (= height of the layouts)
- lacktriangle minimize the width, i.e.,  $\max\{|L_i| \mid 1 \leq i \leq h\}$
- minimize the longest edge, i.e.,  $\max\{j-i \mid (u,v) \in A, u \in L_i, v \in L_j\}$
- lacksquare minimize the total edge length (pprox number of dummy vertices)

#### Height Minimization



**Idea:** assign each vertex v to the layer  $L_i$  for which i is the length of the longest simple path from a source to v

- lacksquare all predecessors are below v
- $\blacksquare$  the total height h is minimal

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#### **Algorithm**

- $L_1 \leftarrow$  set of all sources of D
- lacksquare set y(u)=1 for all  $u\in L_1$
- lacksquare while  $D 
  eq \emptyset$ 
  - $\blacksquare$  remove  $L_1$  from D and assign  $L_1 \leftarrow$  new set of sources
  - $\blacksquare$  set  $y(u) \leftarrow \max_{v \in N^{\leftarrow}(u)} \{y(v)\} + 1$  for all  $u \in L_1$

### Height Minimization



**Idea:** assign each vertex v to the layer  $L_i$  for which i is the length of the longest simple path from a source to v

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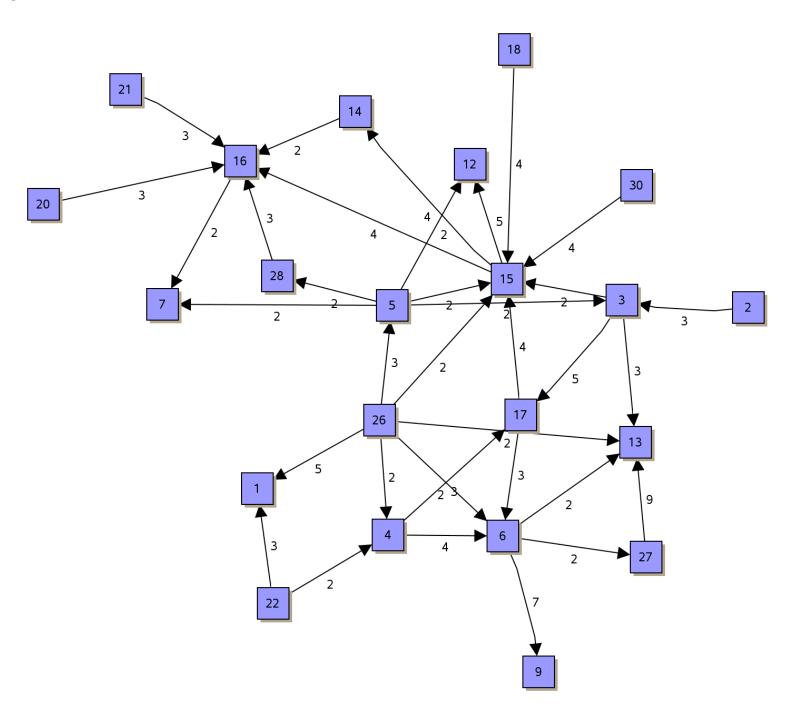
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- $\blacksquare$  while  $D \neq \emptyset$ 
  - $\blacksquare$  remove  $L_1$  from D and assign  $L_1 \leftarrow$  new set of sources
  - set  $y(u) \leftarrow \max_{v \in N^{\leftarrow}(u)} \{y(v)\} + 1$  for all  $u \in L_1$

Can we implement this idea in linear time O(|V| + |A|)?

Ves! Topological sorting of week set

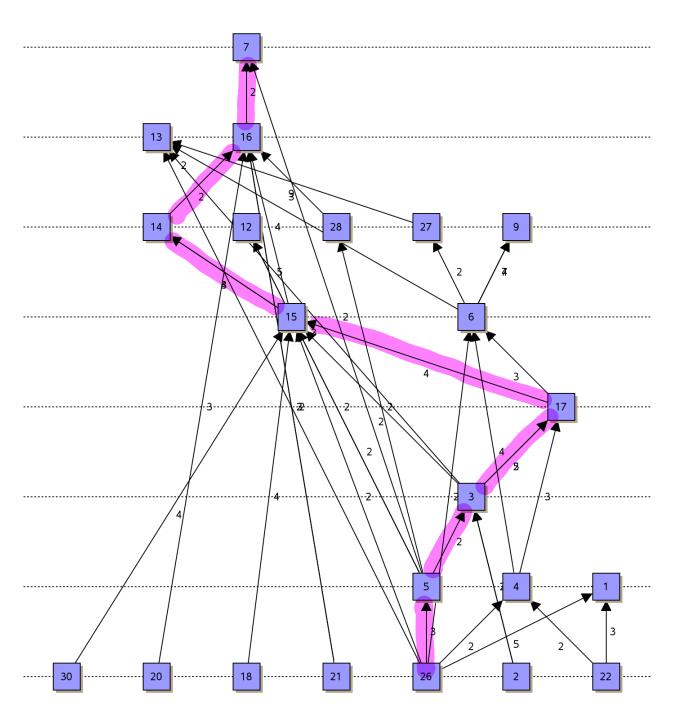
# Example





# Example





#### Minimizing Total Edge Length



Can be formulated as an integer linear program:

min	$\sum_{(u,v)\in A} (y(v) - y(u))$	
	$y(v) - y(u) \ge 1$	$\forall (u,v) \in A$
	$y(v) \ge 1$	$\forall v \in V$
	$y(v) \in \mathbb{Z}$	$\forall v \in V$

#### Minimizing Total Edge Length



Can be formulated as an integer linear program:

$$\begin{array}{ll} \min & \sum_{(u,v)\in A}(y(v)-y(u)) \\ \text{subject to} & y(v)-y(u)\geq 1 & \forall (u,v)\in A \\ & y(v)\geq 1 & \forall v\in V \\ & y(v)\in \mathbb{Z} & \forall v\in V \end{array}$$

#### One can show that:

- constraint matrix is totally unimodular
- lacksquare  $\Rightarrow$  solution of the relaxed linear program is integral
- total edge length can be minimized in polynomial time

#### Announcements



- The class on June 12 is shifted to Monday, June 11 in the same time slot 9:00–11:00 in seminar room 186.
- Student presentations from exercise groups will take place on July 3, 10:00–12:00 and 13:00–15:00.
- We are running an experimental online study on human vs. machine drawings of small graphs. You are all invited to participate:

http://tinyurl.com/turingGD

oral exams: early July or late September