

# Dynamic trees (Steator and Tarjan 83)

# Operations that we do on the trees

maketree(v)

w = findroot(v)

(w,c) = mincost(v) (can do maxcost(v) instead)

addcost(v,c)

link(v,w,c(v,w))

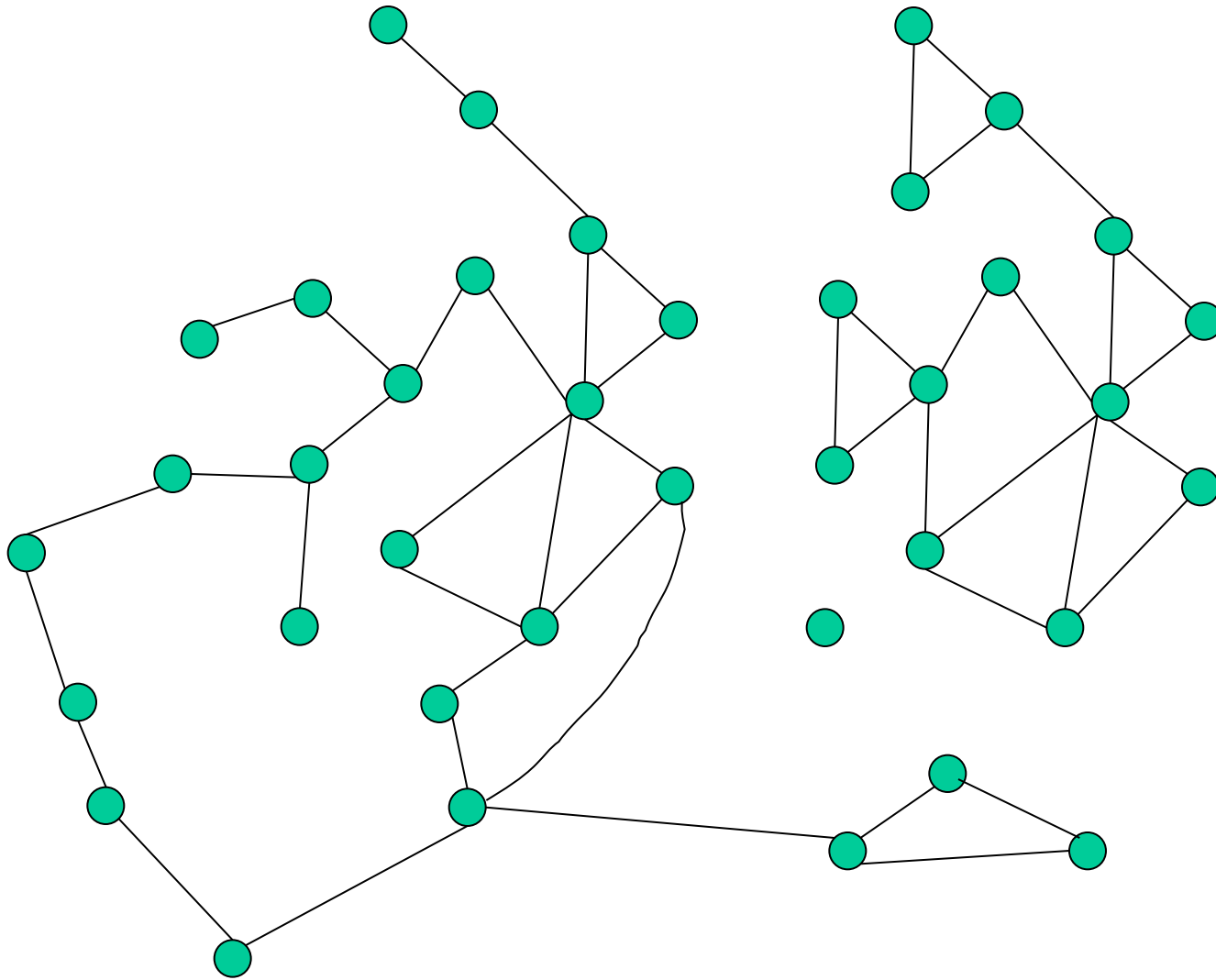
cut(v)

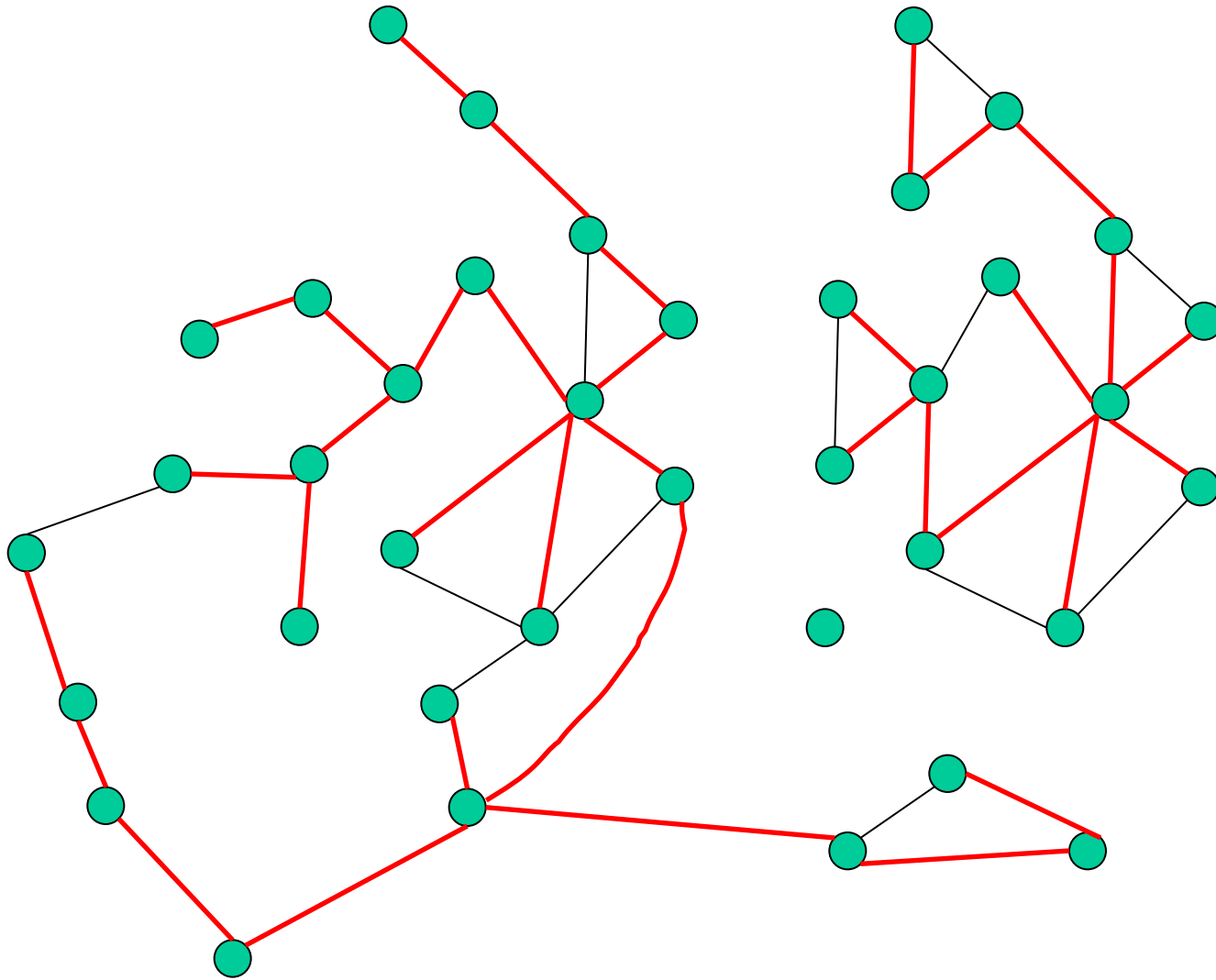
evert(v)

# Applications

# Incremental Minimum Spanning Forest

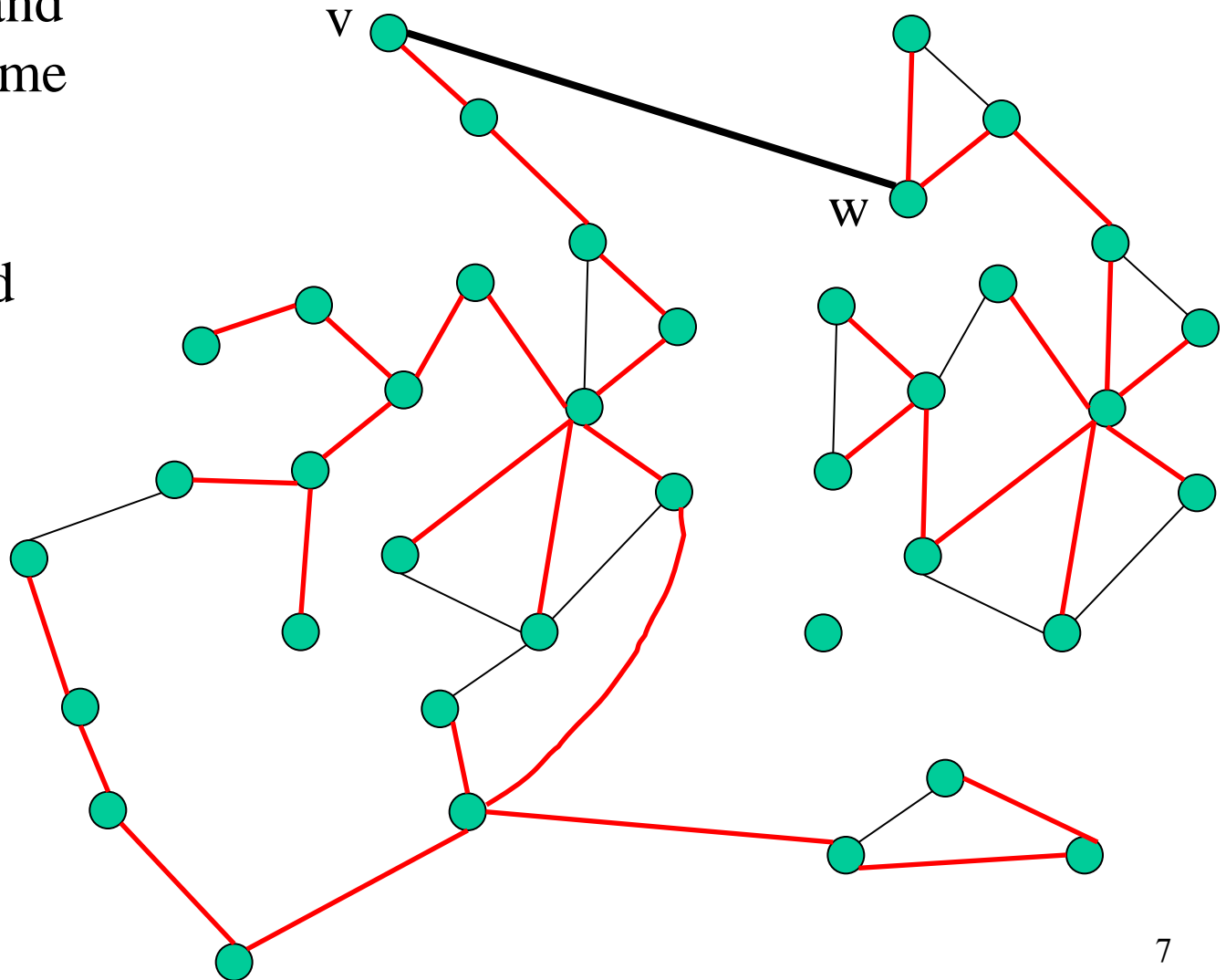
Maintain a minimum spanning forest of a graph to which we  
insert edges





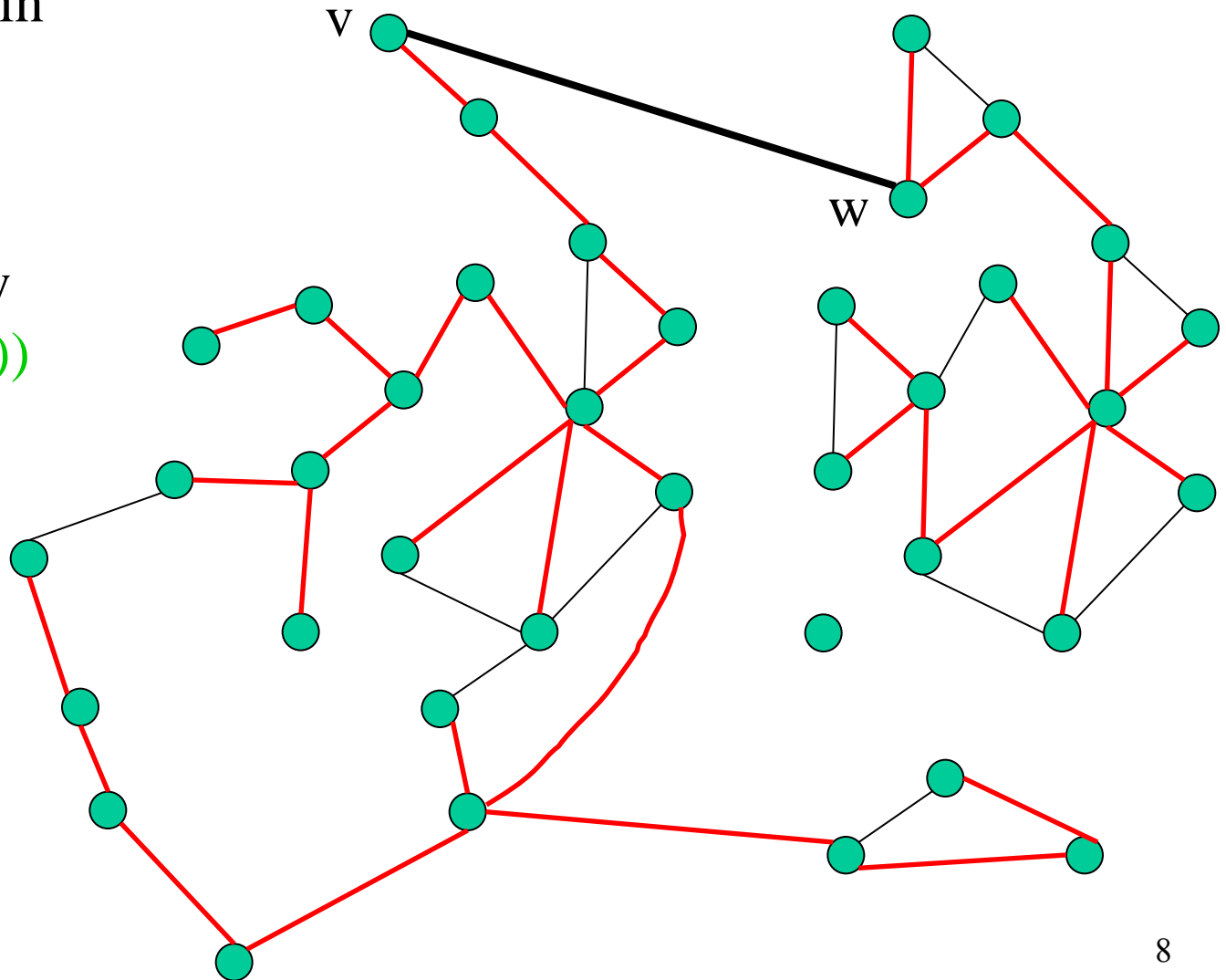
# Add an edge (v,w)

Discover if v and w are in the same component by comparing  $\text{findroot}(v)$  and  $\text{findroot}(w)$



# Add an edge $(v,w)$

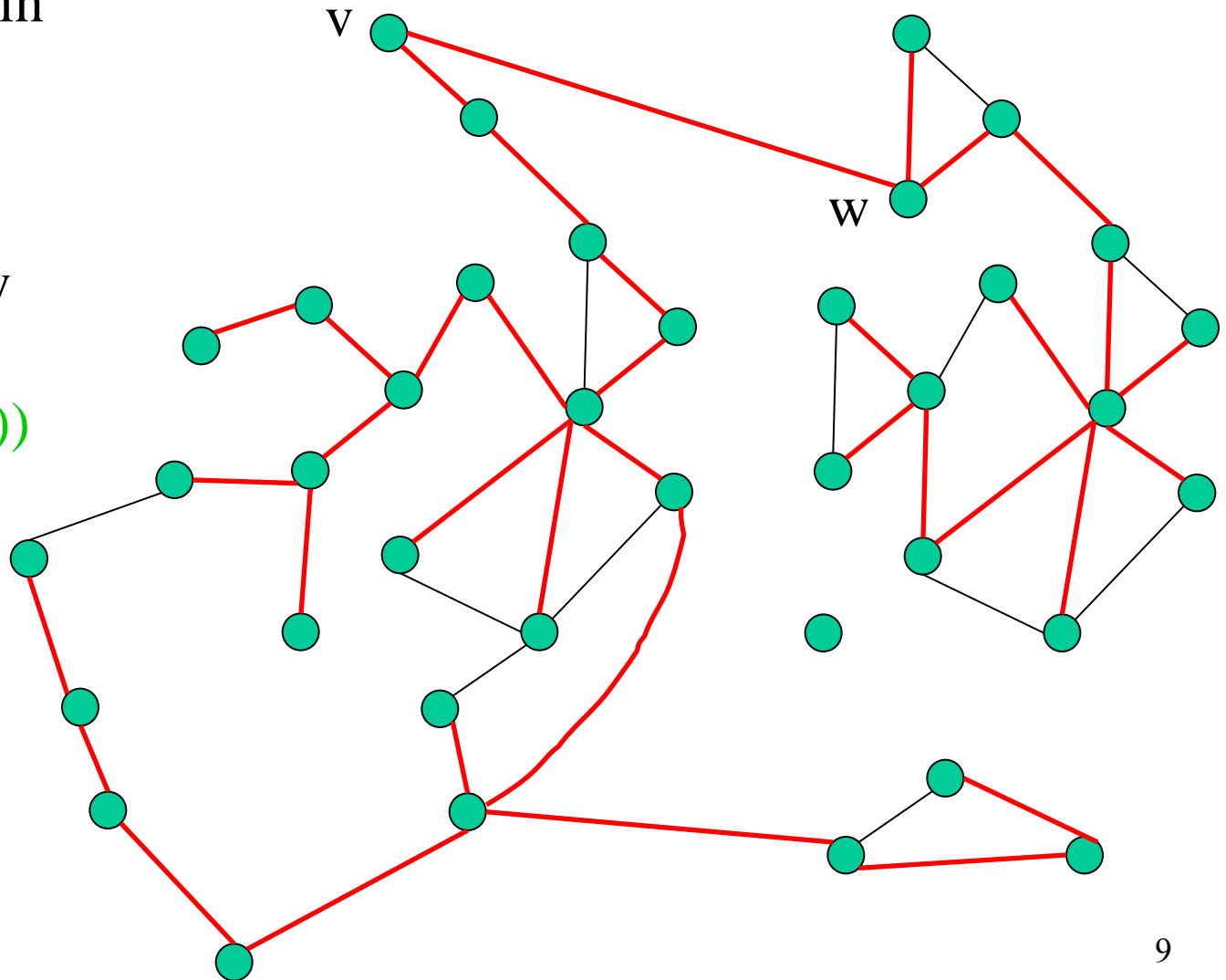
If  $v$  and  $w$  are in different components then add  $(v,w)$  to the forest by  $\text{link}(v,w,c(v,w))$





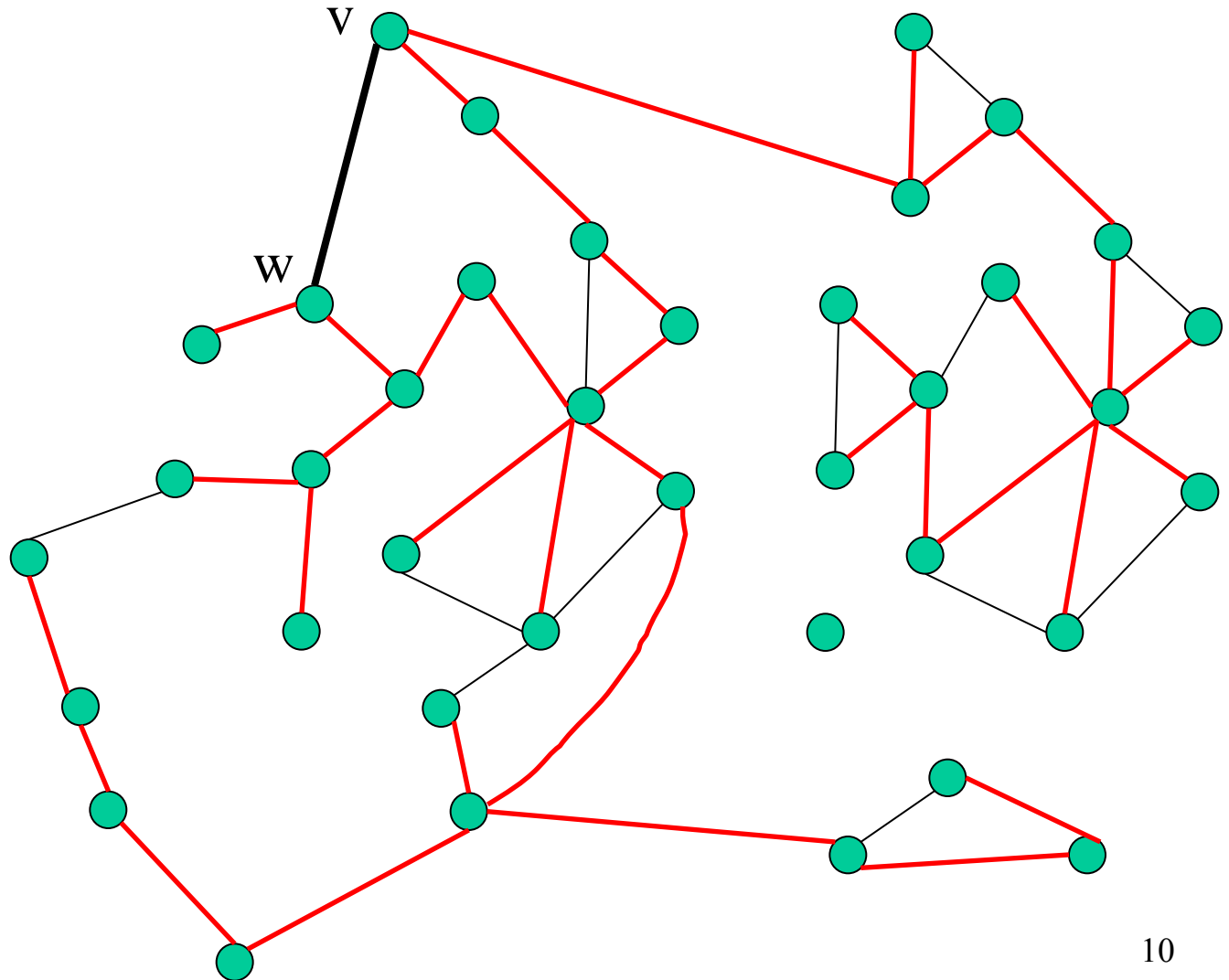
# Add an edge $(v,w)$

If  $v$  and  $w$  are in different components then add  $(v,w)$  to the forest by  $\text{evert}(v)$ , and  $\text{link}(v,w,c(v,w))$



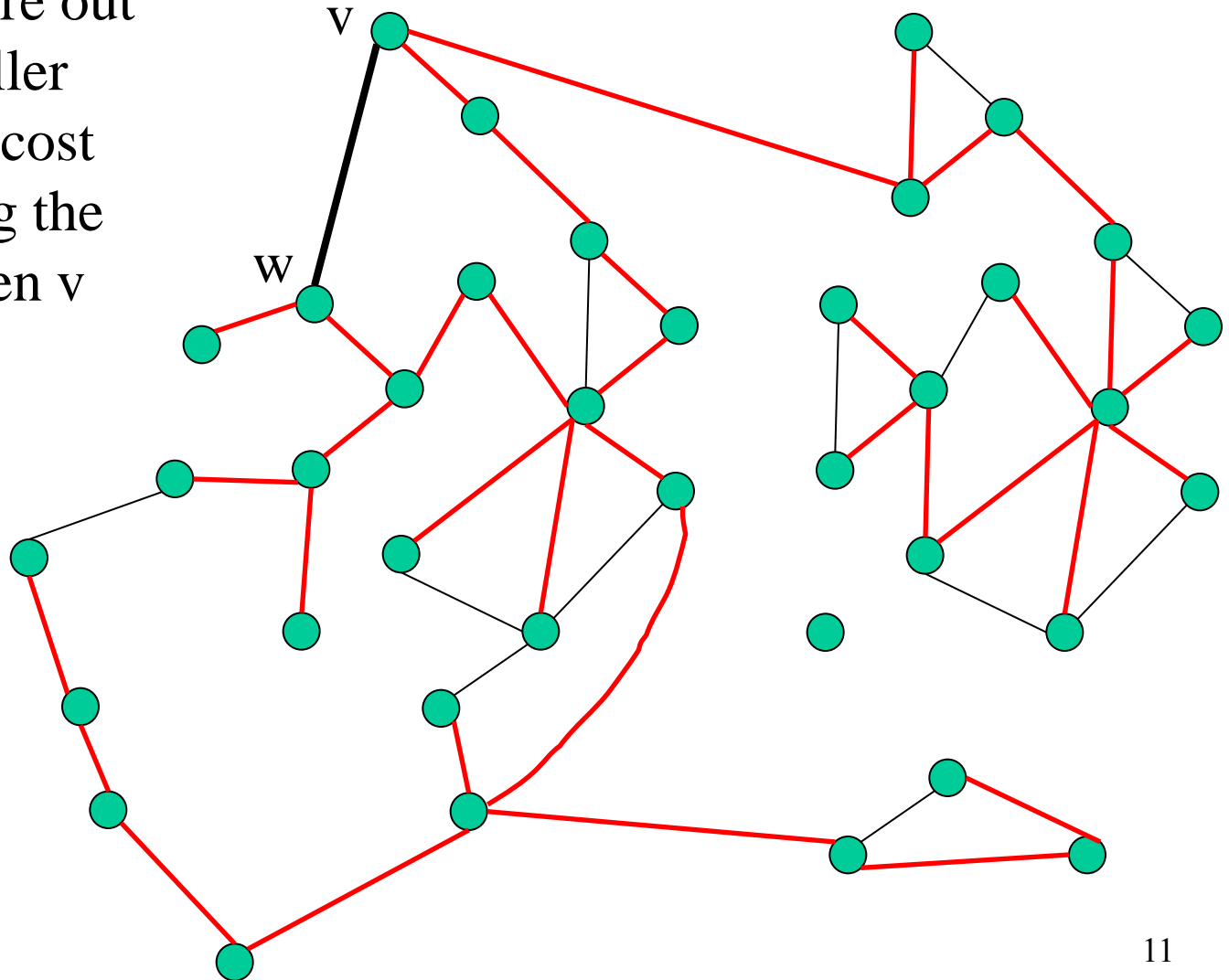
# Add an edge $(v,w)$

What if  $v$  and  $w$  are in same component ?



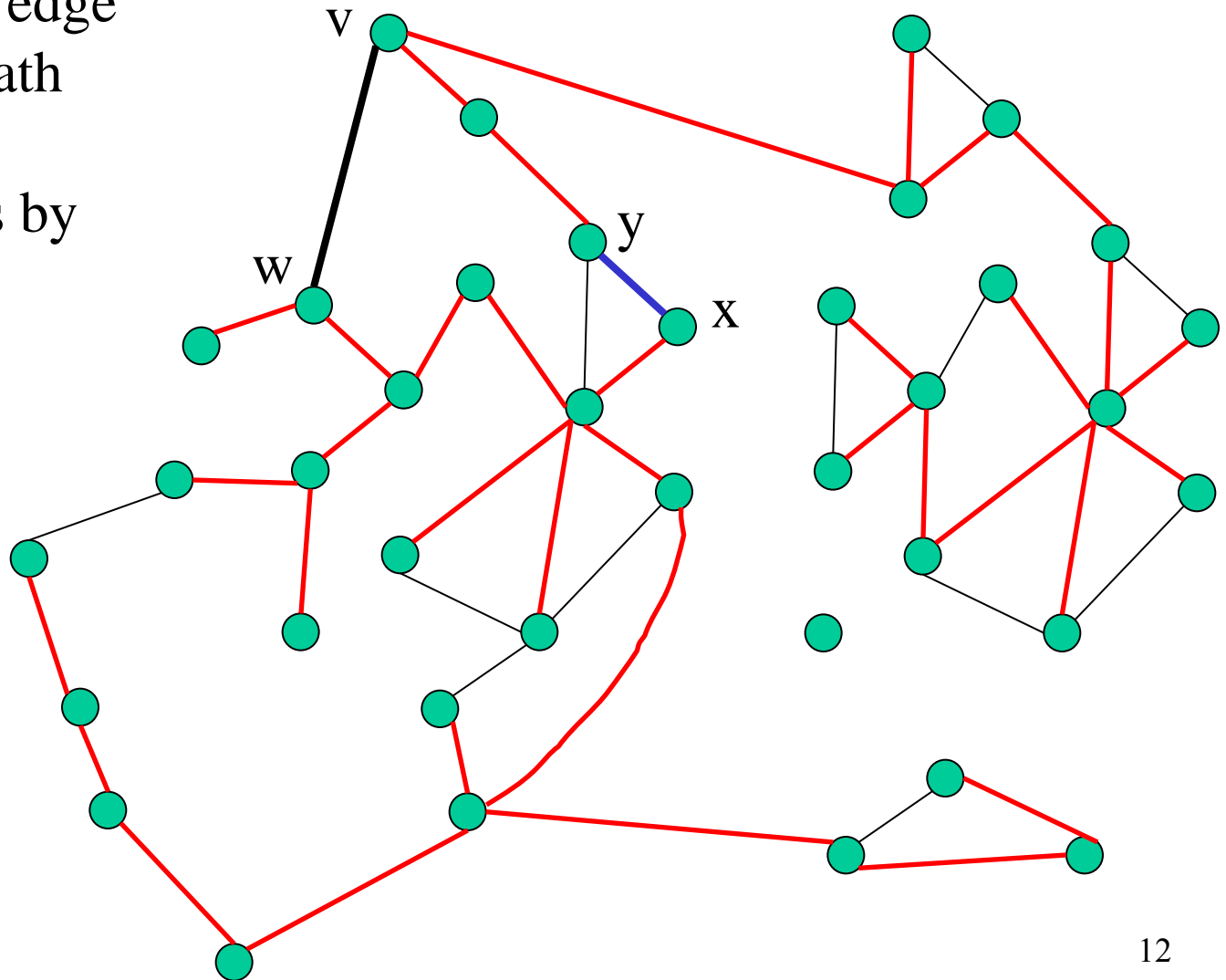
# Add an edge $(v,w)$

We have to figure out if  $c(v,w)$  is smaller than the largest cost of an edge along the tree path between  $v$  and  $w$ .



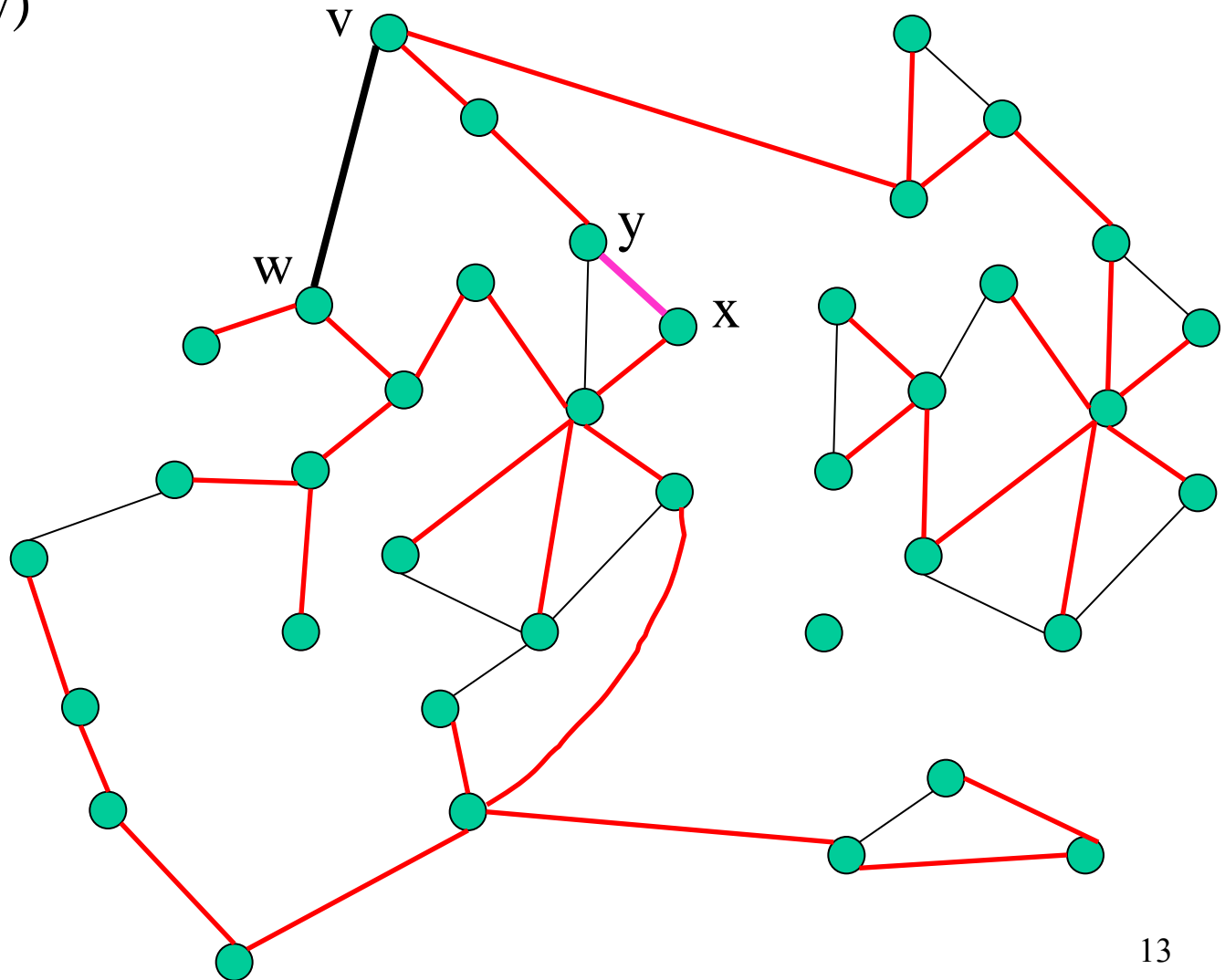
# Add an edge (v,w)

Find the largest edge  
along the tree path  
from v to w by  
 $\text{evert}(v)$  follows by  
 $\text{maxcost}(w)$



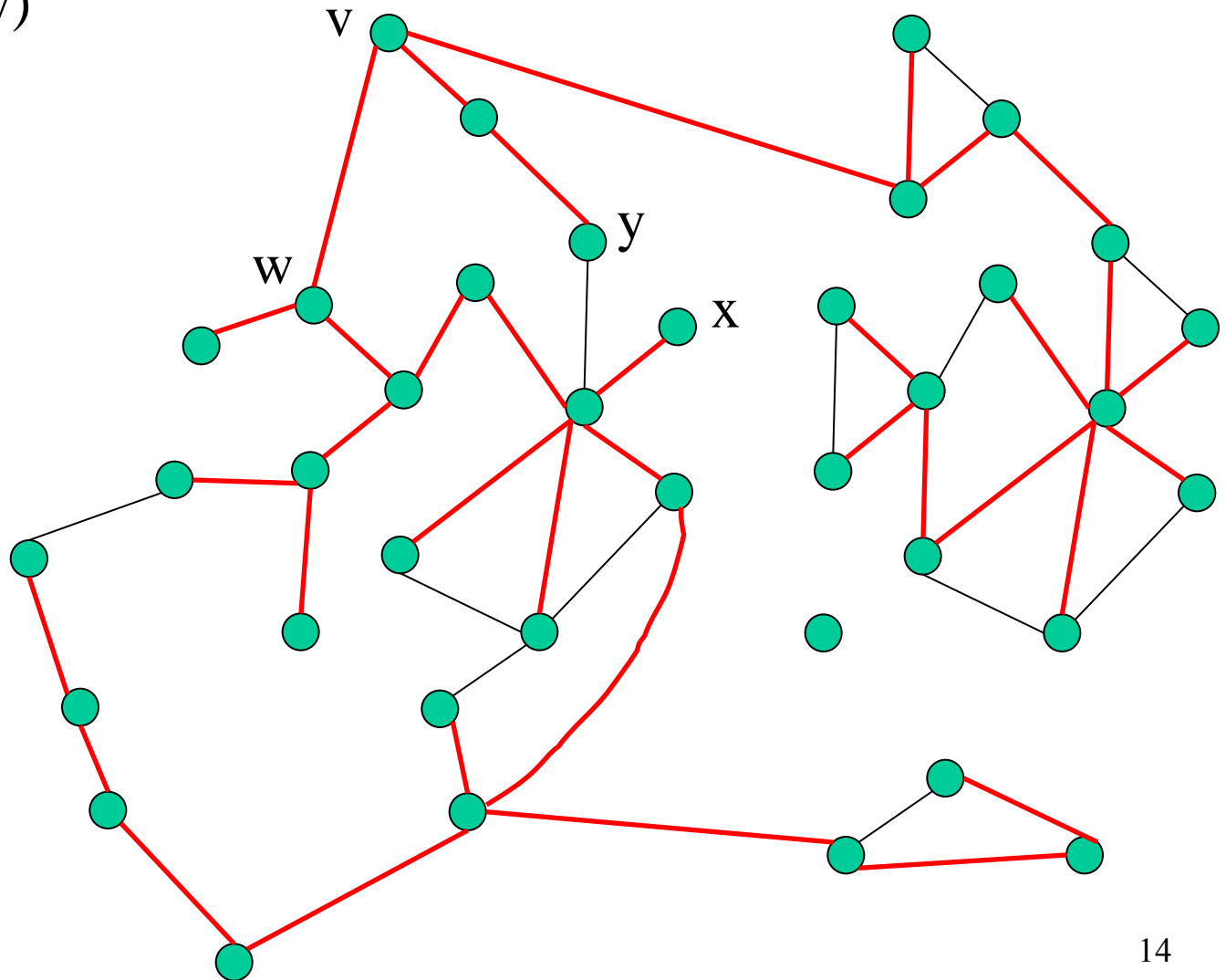
# Add an edge (v,w)

If  $c(v,w) < c(x,y)$   
then **cut(x,y)** and  
**link(v,w,c(v,w))**



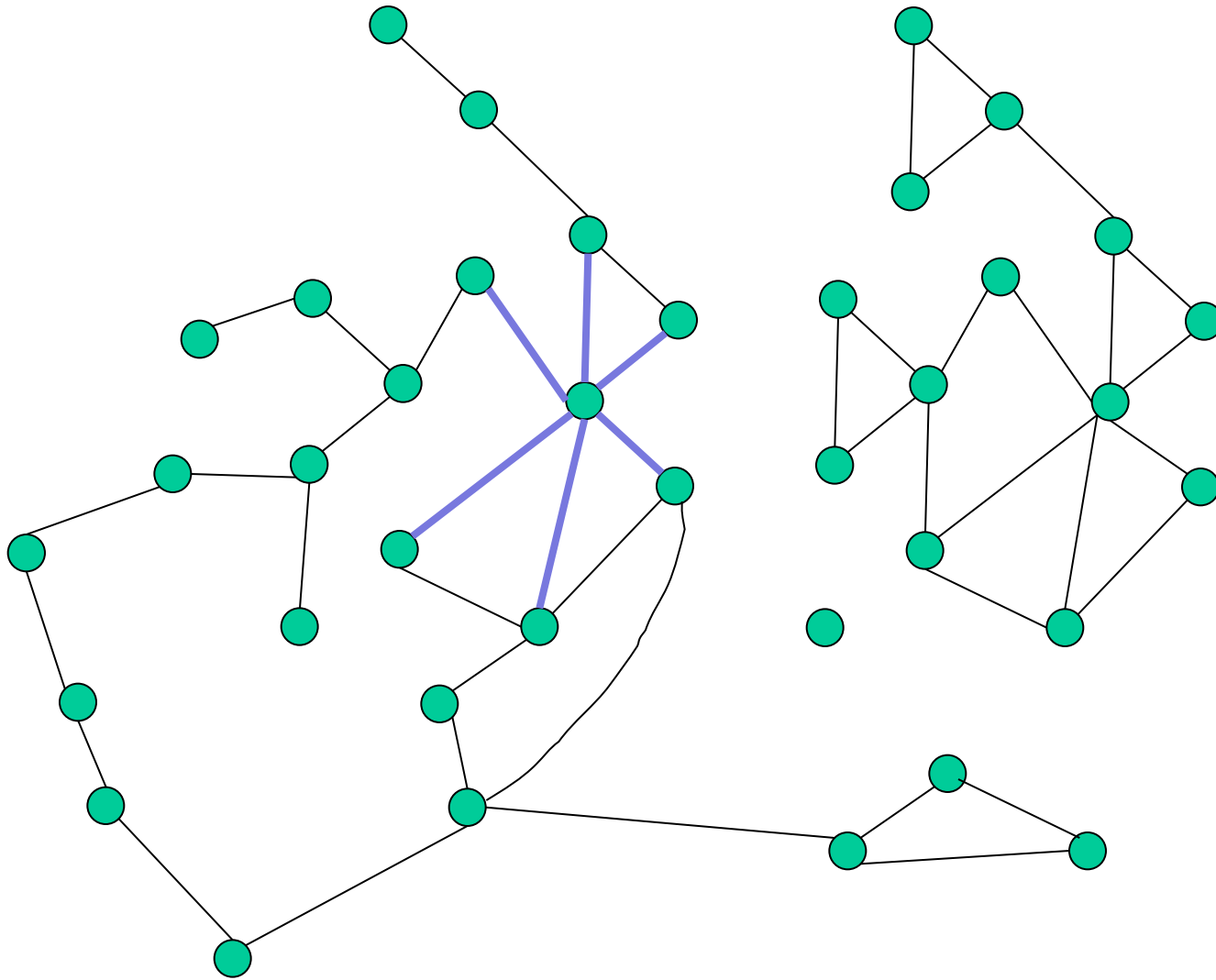
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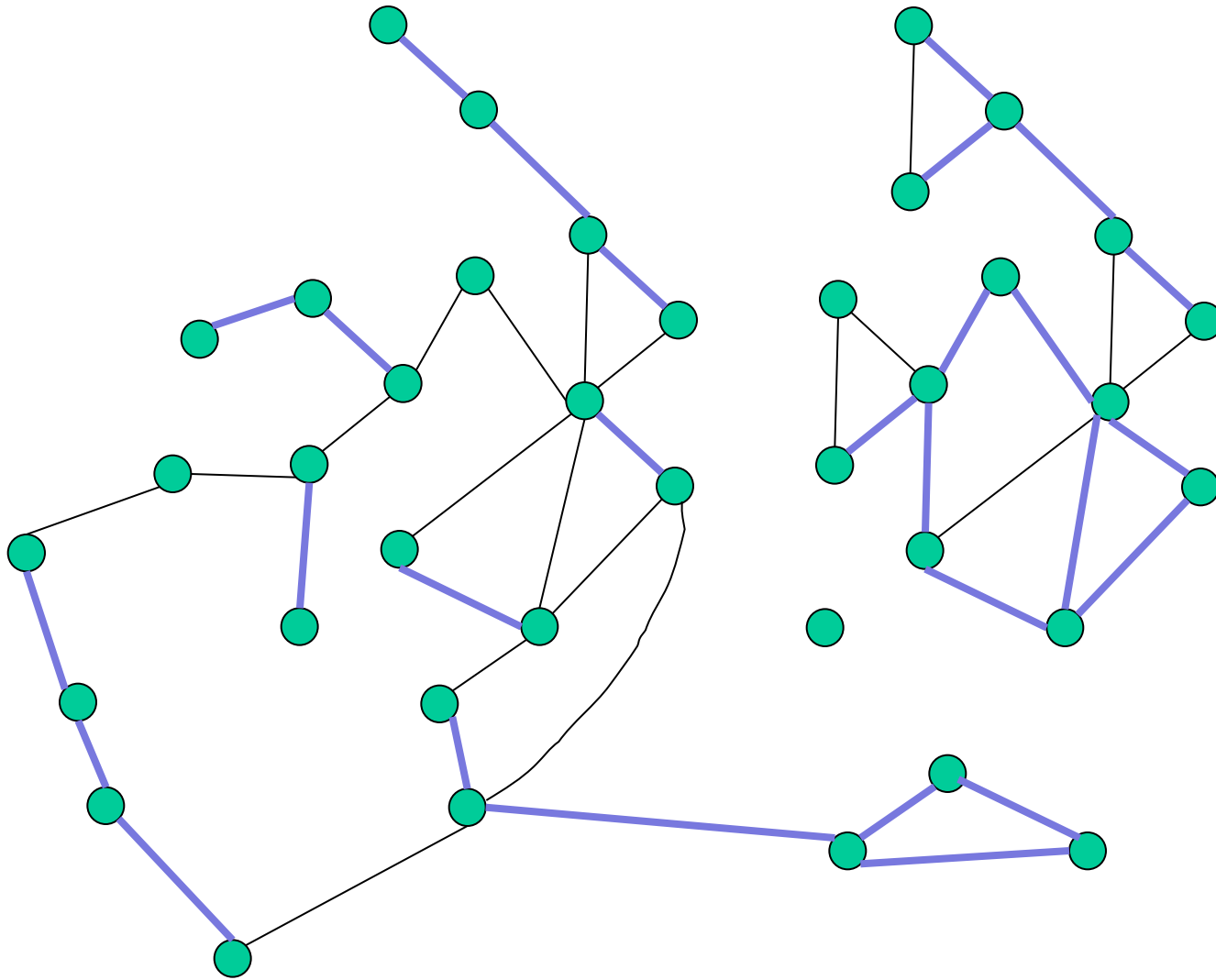


## Application (2)

- Minimum spanning forest with a particular number of **blue** edges

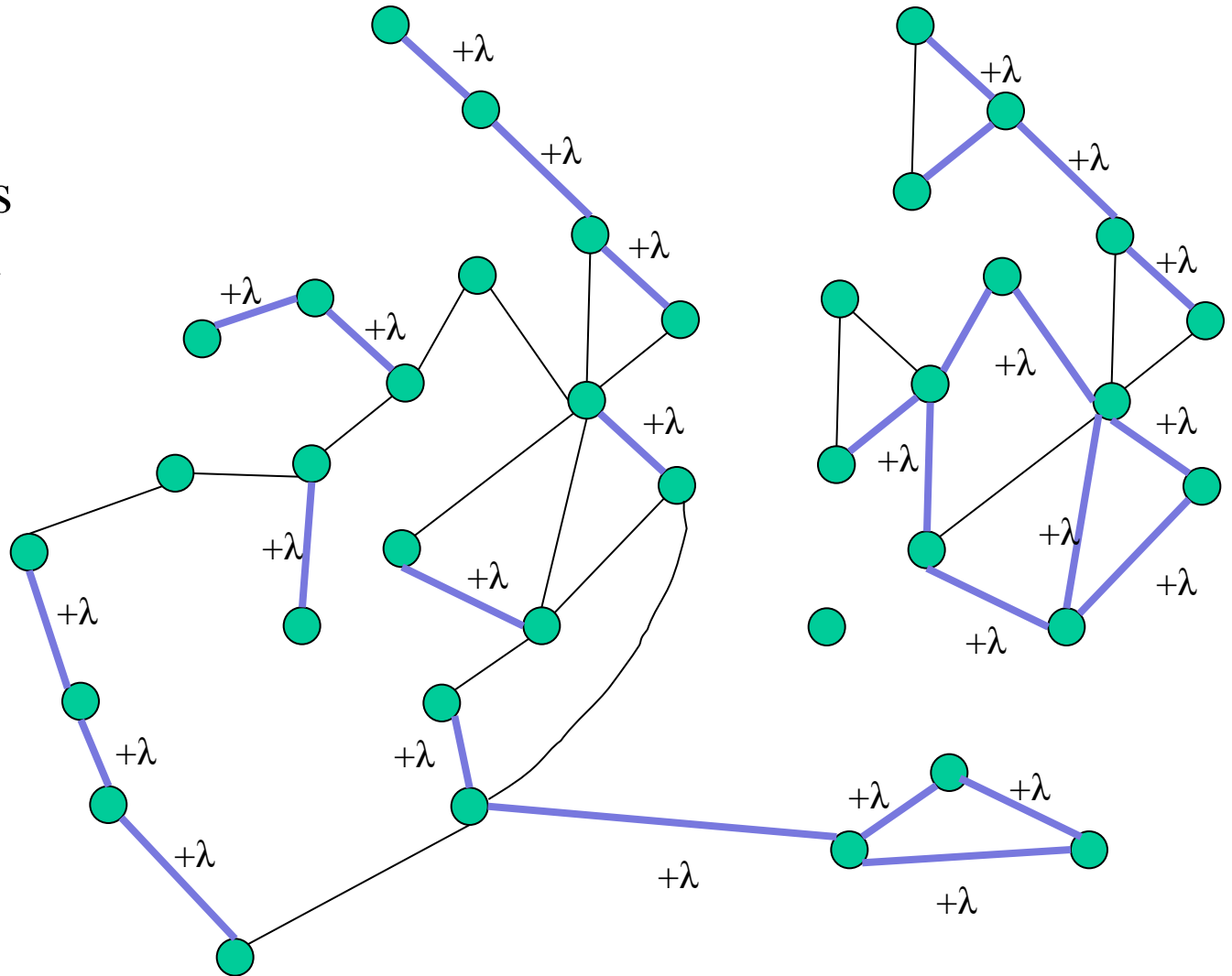


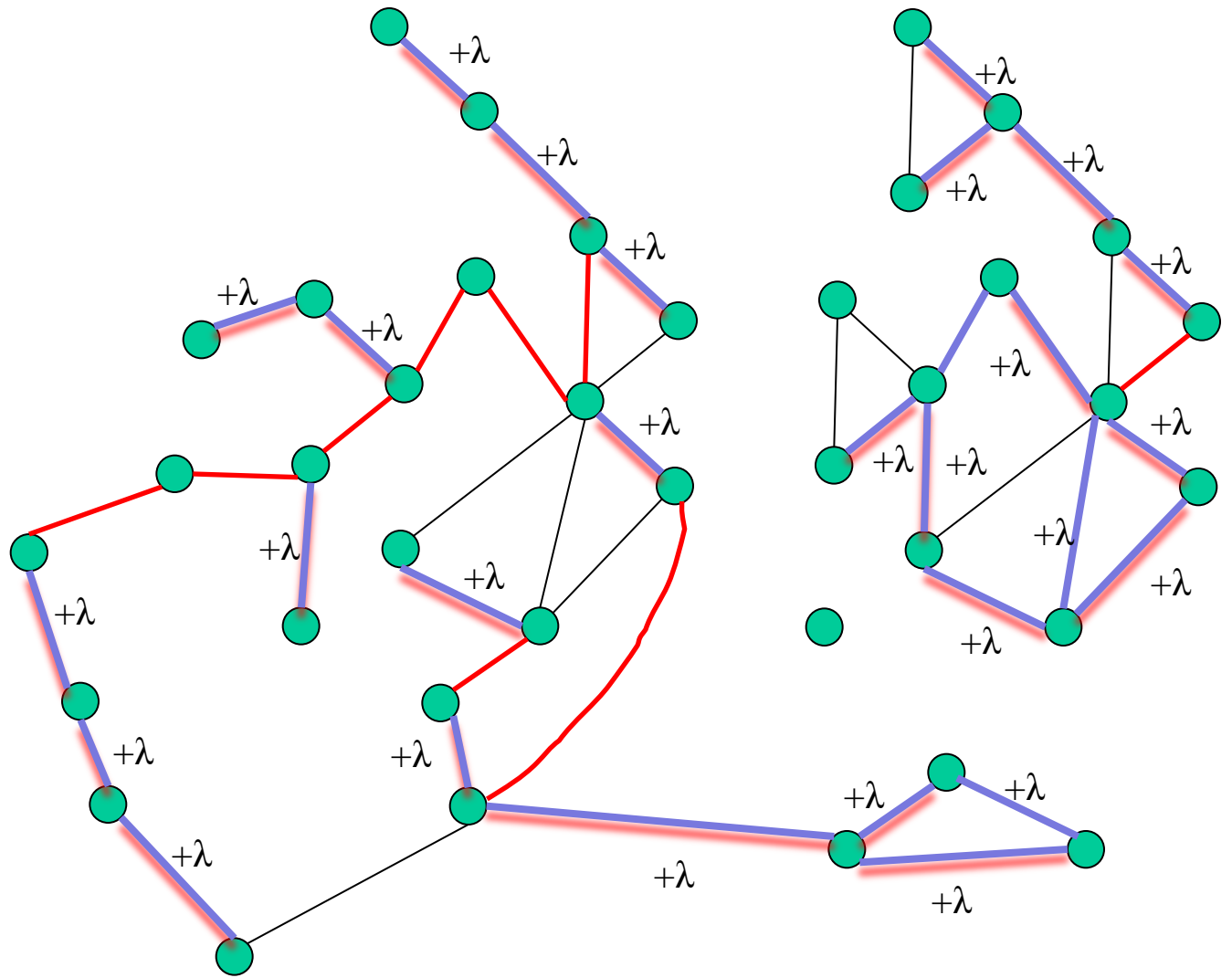




Suppose we add  $\lambda$  to the weights of the blue edges and compute the MSF

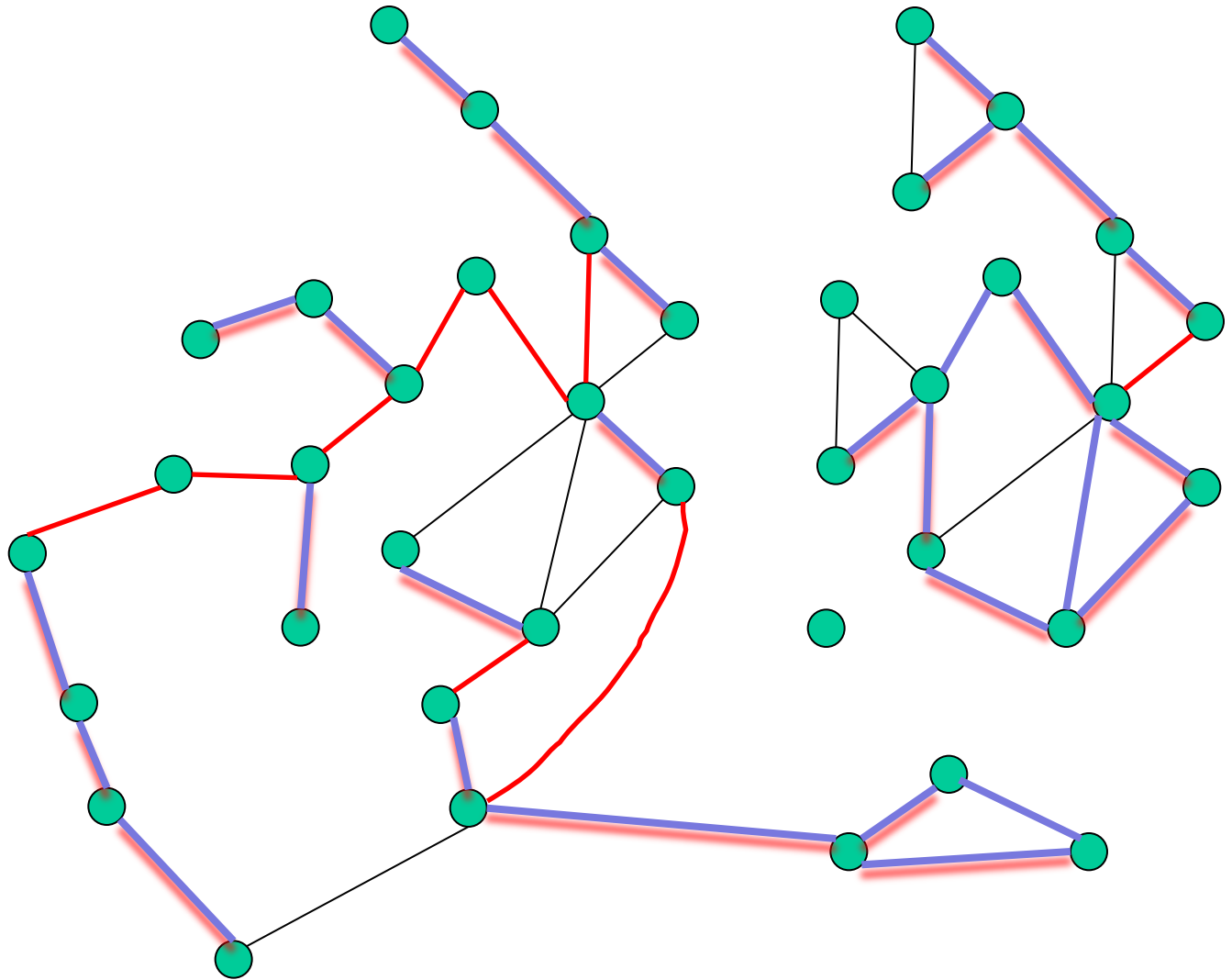
If  $\lambda = -\infty$  we will get a MSF with as many blue edges as possible



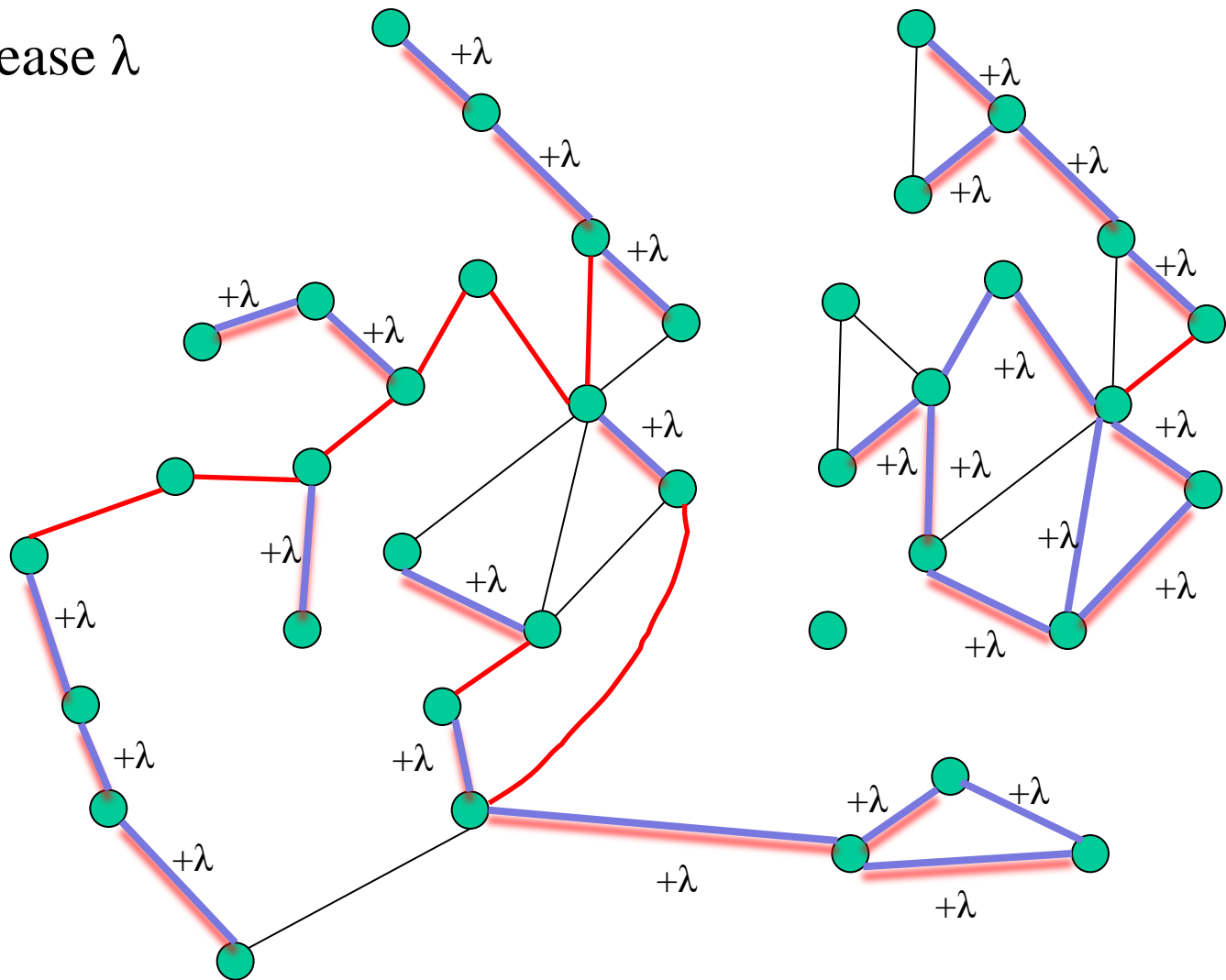


The blue edges excluded cannot be in any MSF.  
Black edges included will be in any MSF

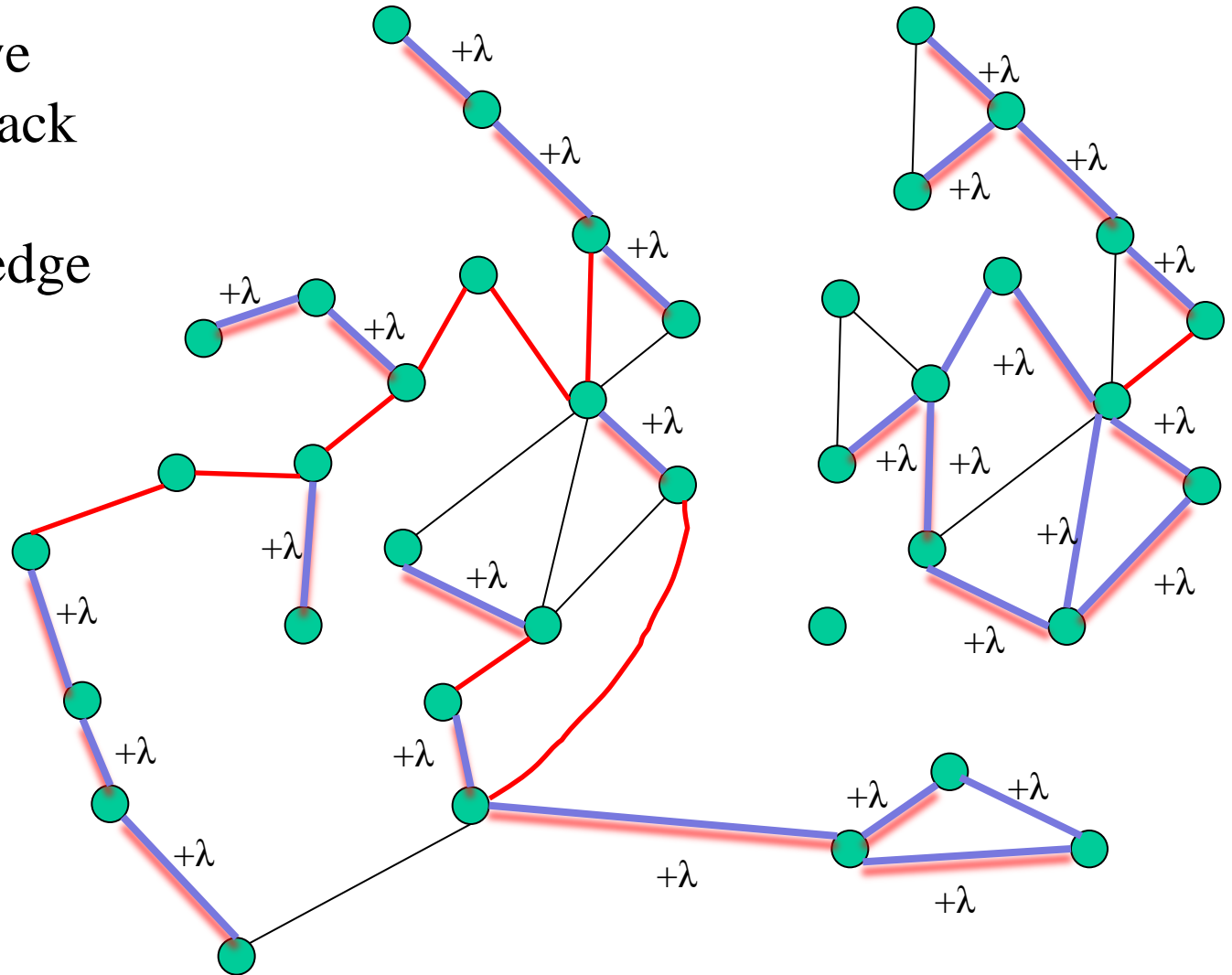
Let  $M$  be the maximum # of blue edges in a spanning forest



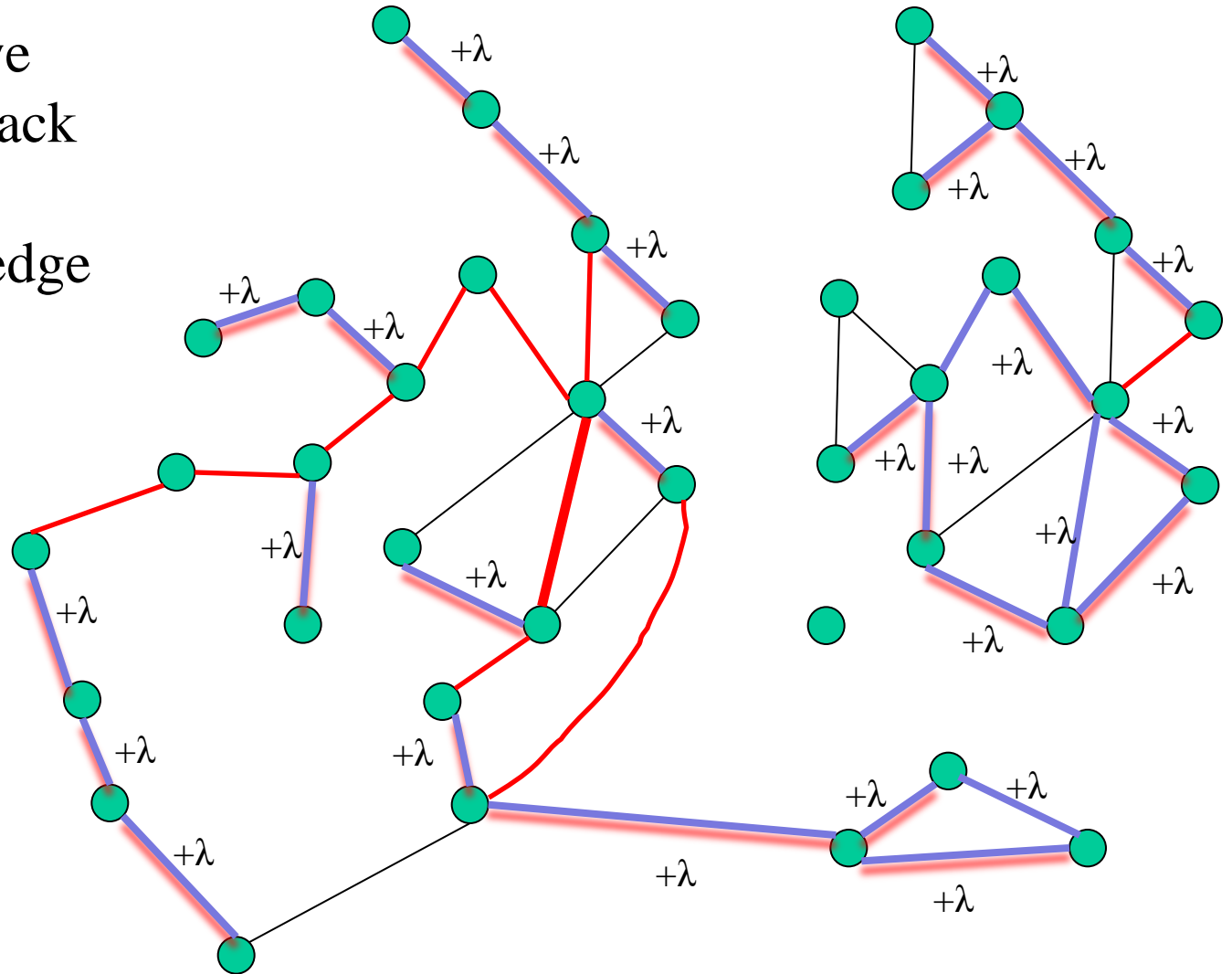
Imagine we increase  $\lambda$



At some point we would trade a black edge for a more expensive blue edge

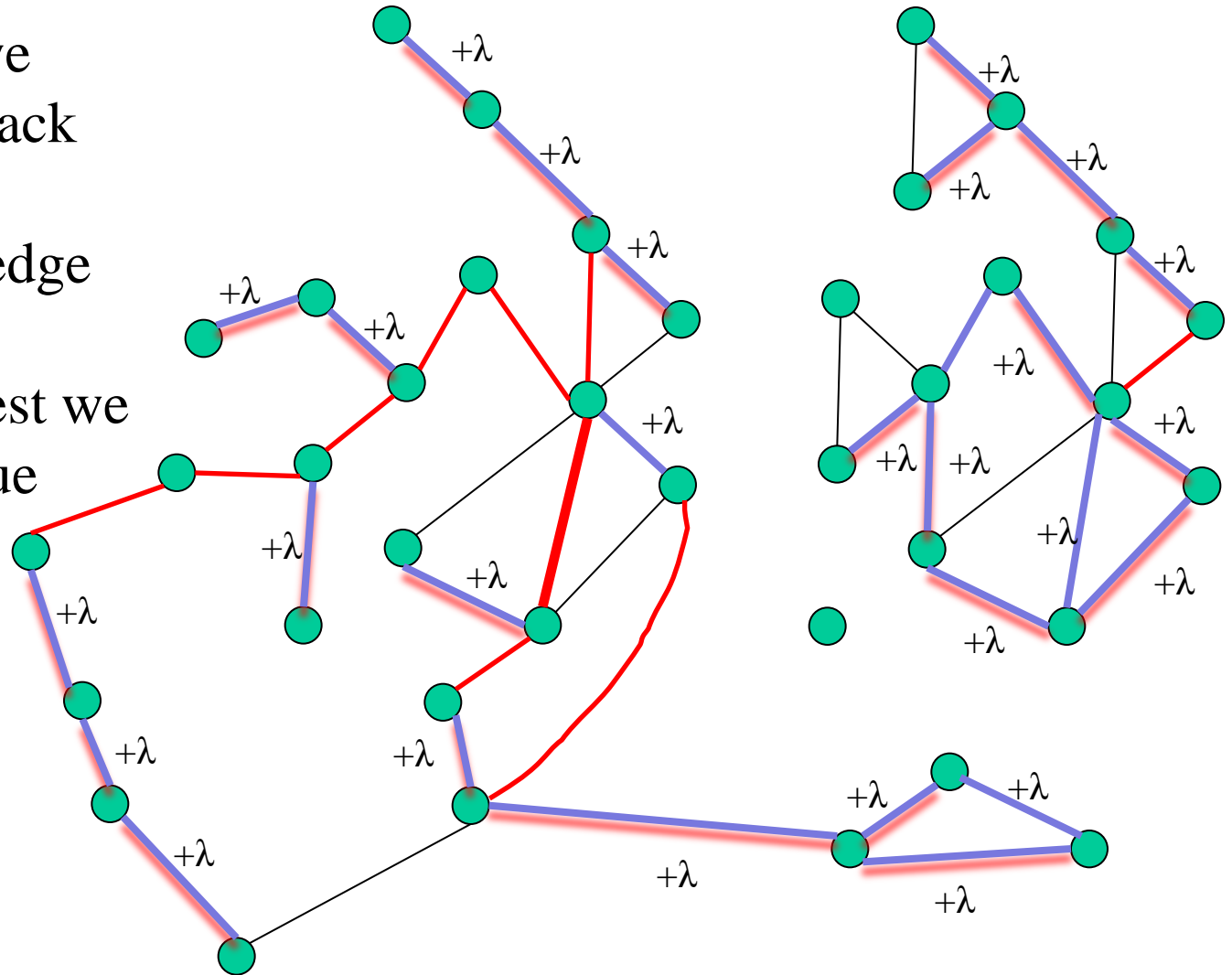


At some point we would trade a black edge for a more expensive blue edge



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Let  $T$  be the forest we get with  $M-1$  blue edges

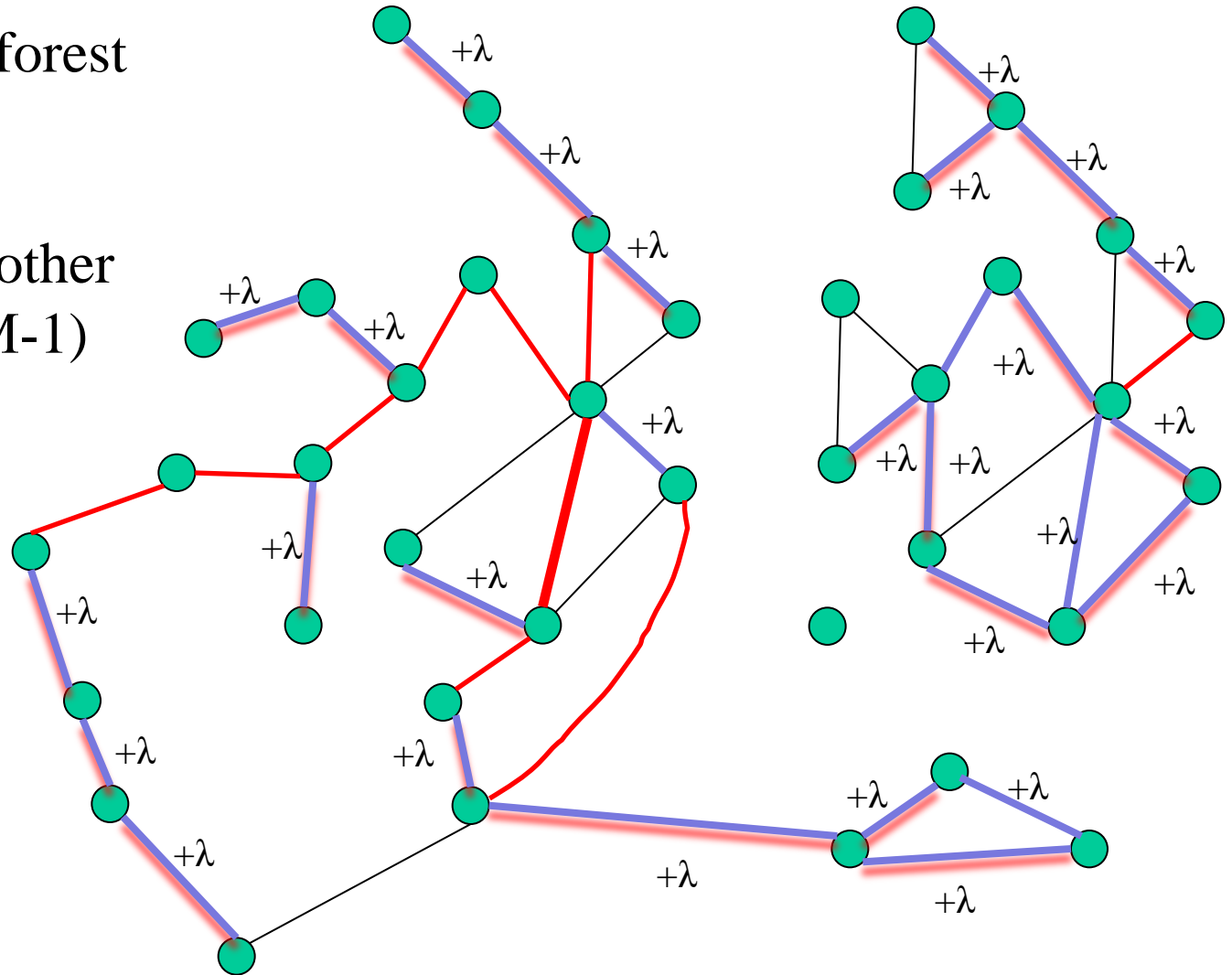




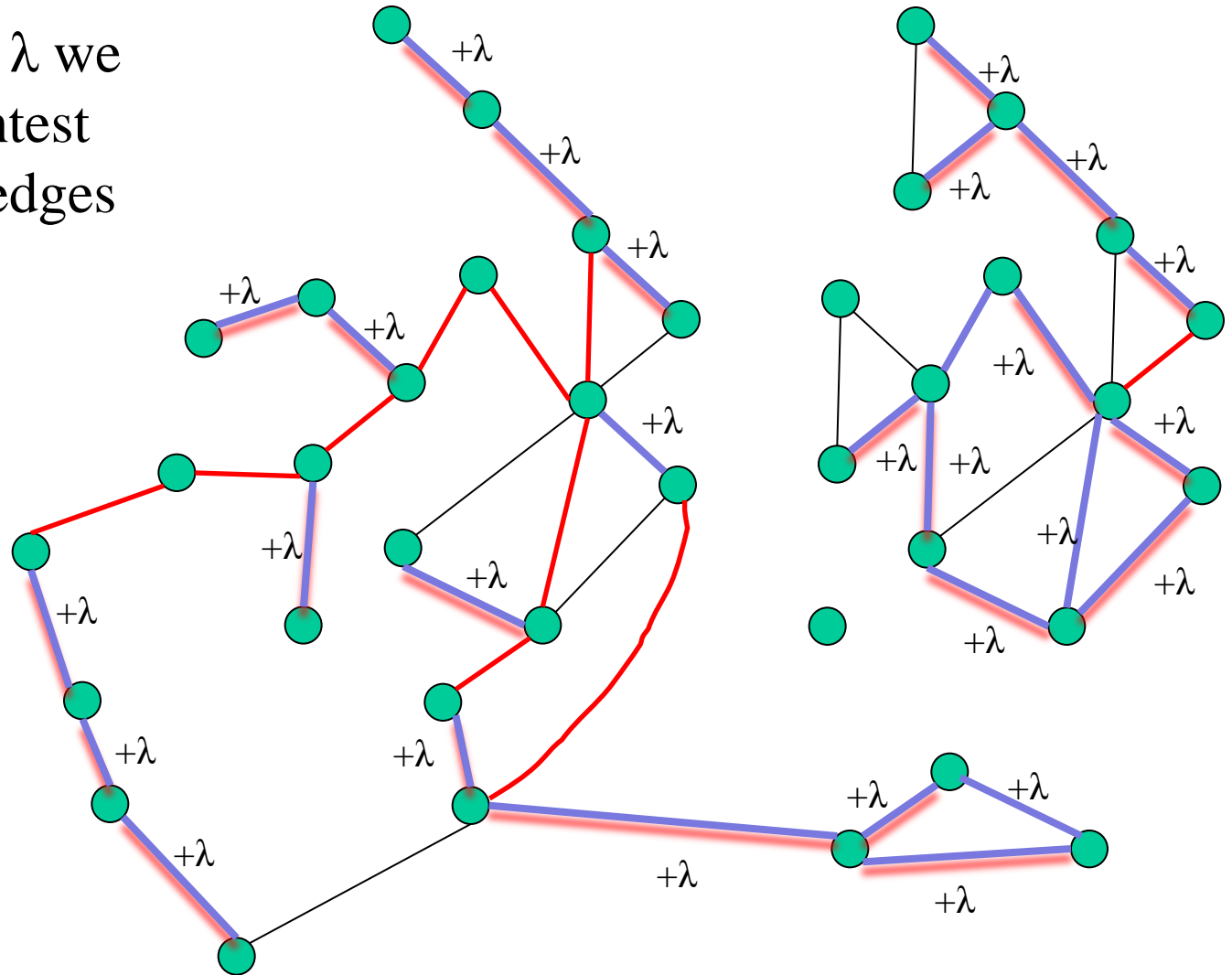
The cost of this forest is  
is  $(M-1)\lambda + c(T)$

The cost of any other  
forest  $T'$  with  $(M-1)$   
blue edges is  
 $(M-1)\lambda + c(T')$

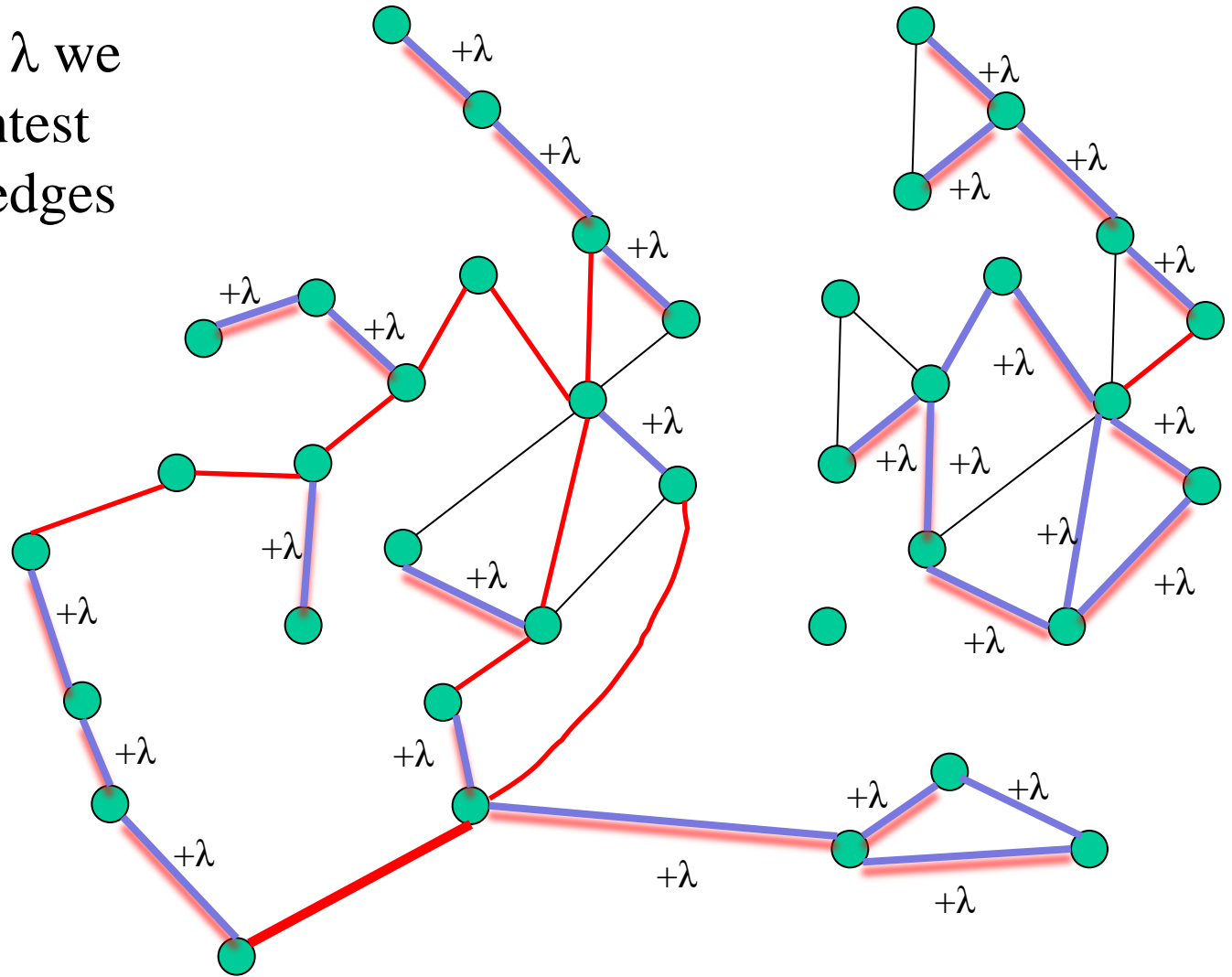
$\rightarrow c(T) < c(T')$



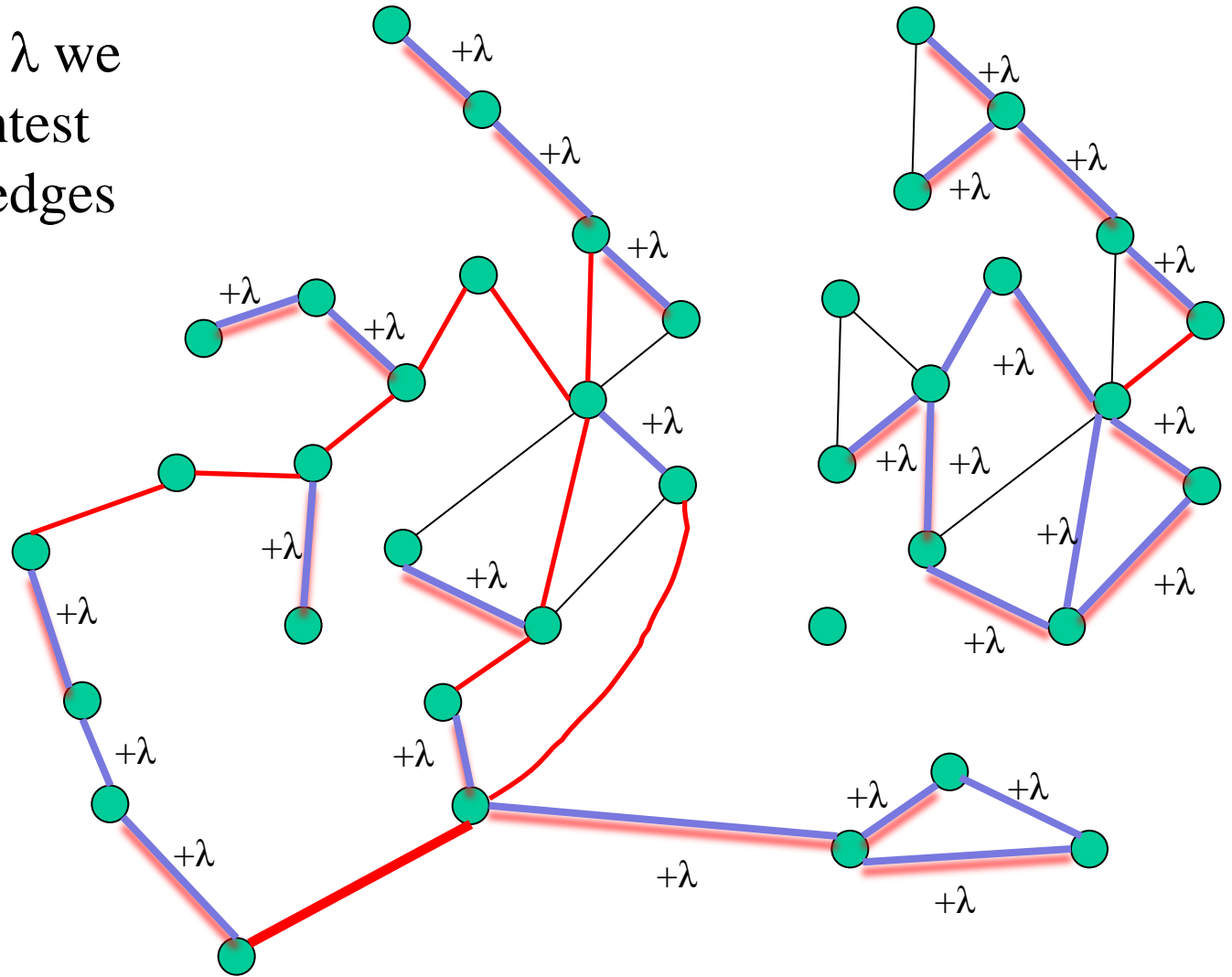
Keep increasing  $\lambda$  we will find the lightest MSF with  $M-2$  edges and so on..



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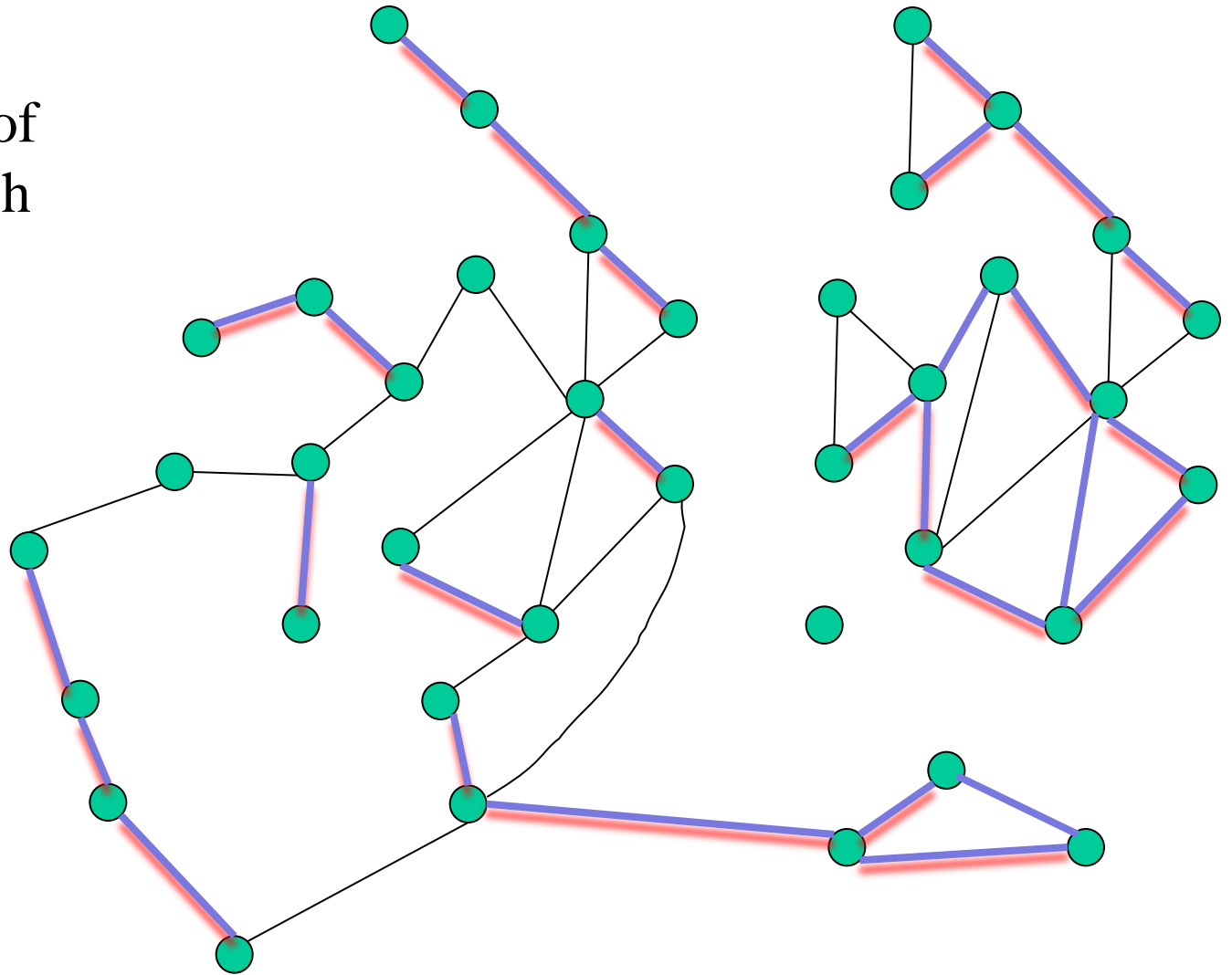
Keep increasing  $\lambda$  we will find the lightest MSF with  $M-2$  edges and so on..



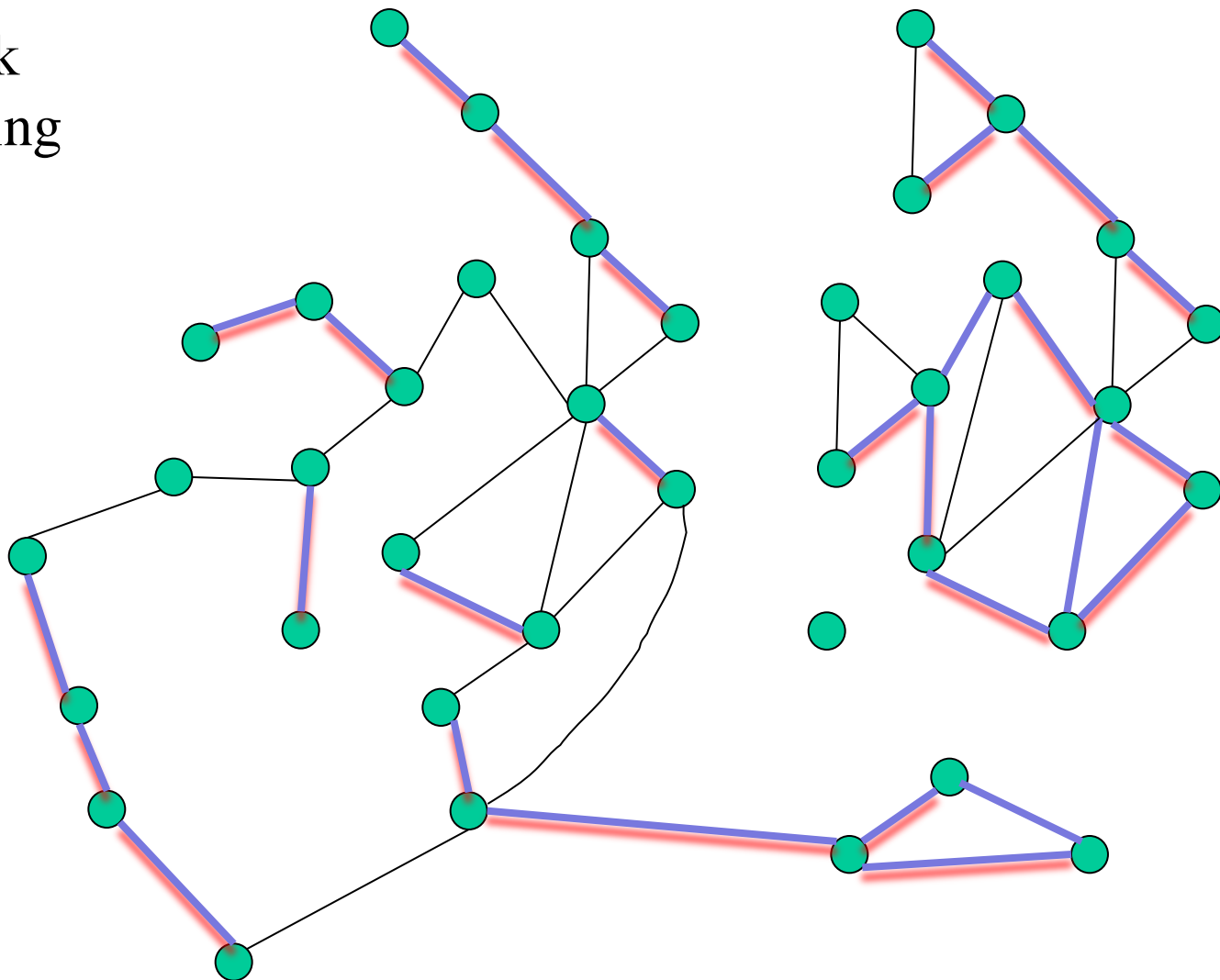
# The key observation

- We can find the critical values of  $\lambda$  efficiently

Start with a  
spanning forest of  
the blue subgraph

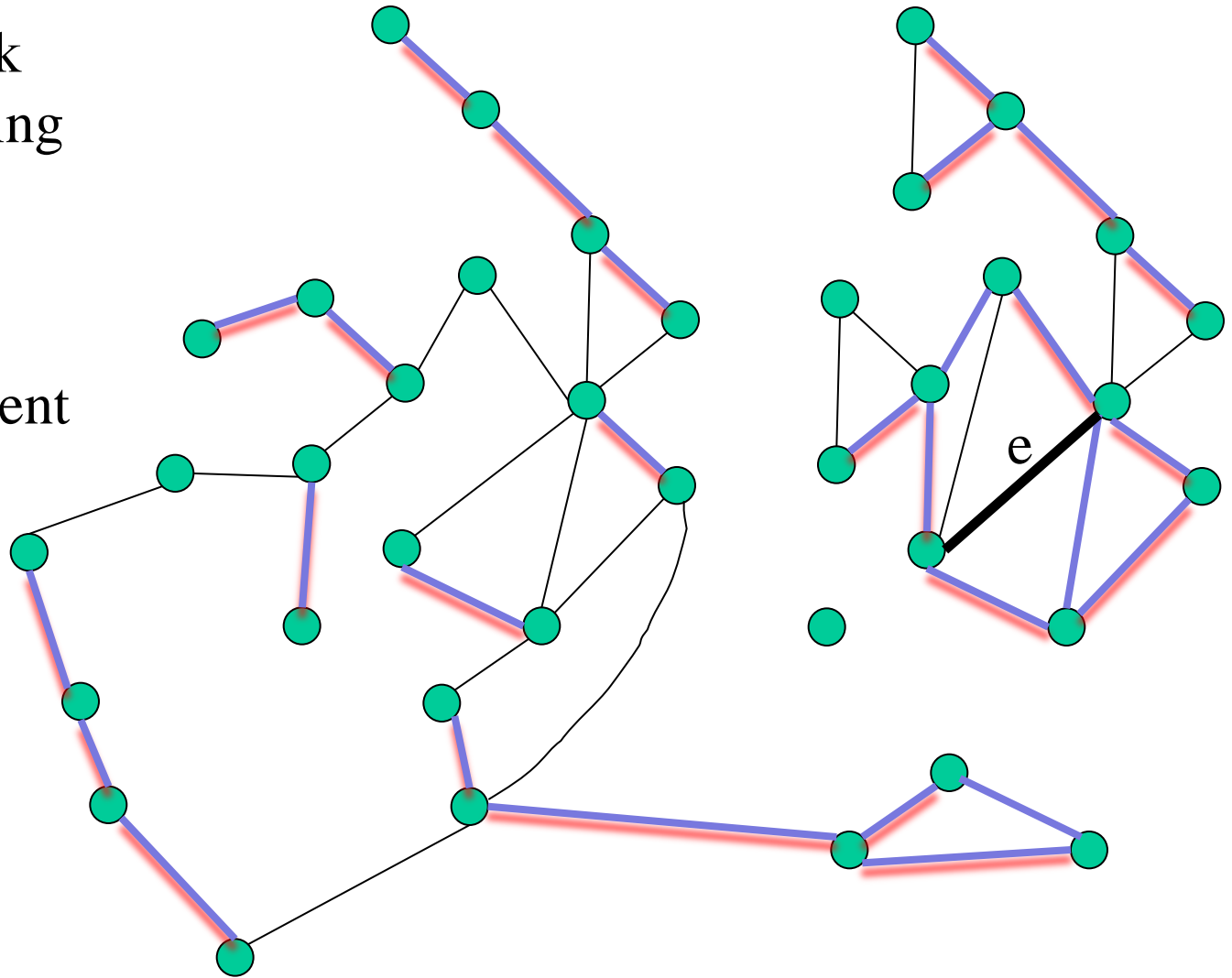


Process the black edges in increasing order of their weight



Process the black edges in increasing order of their weight

Let  $e$  be the current **black** edge

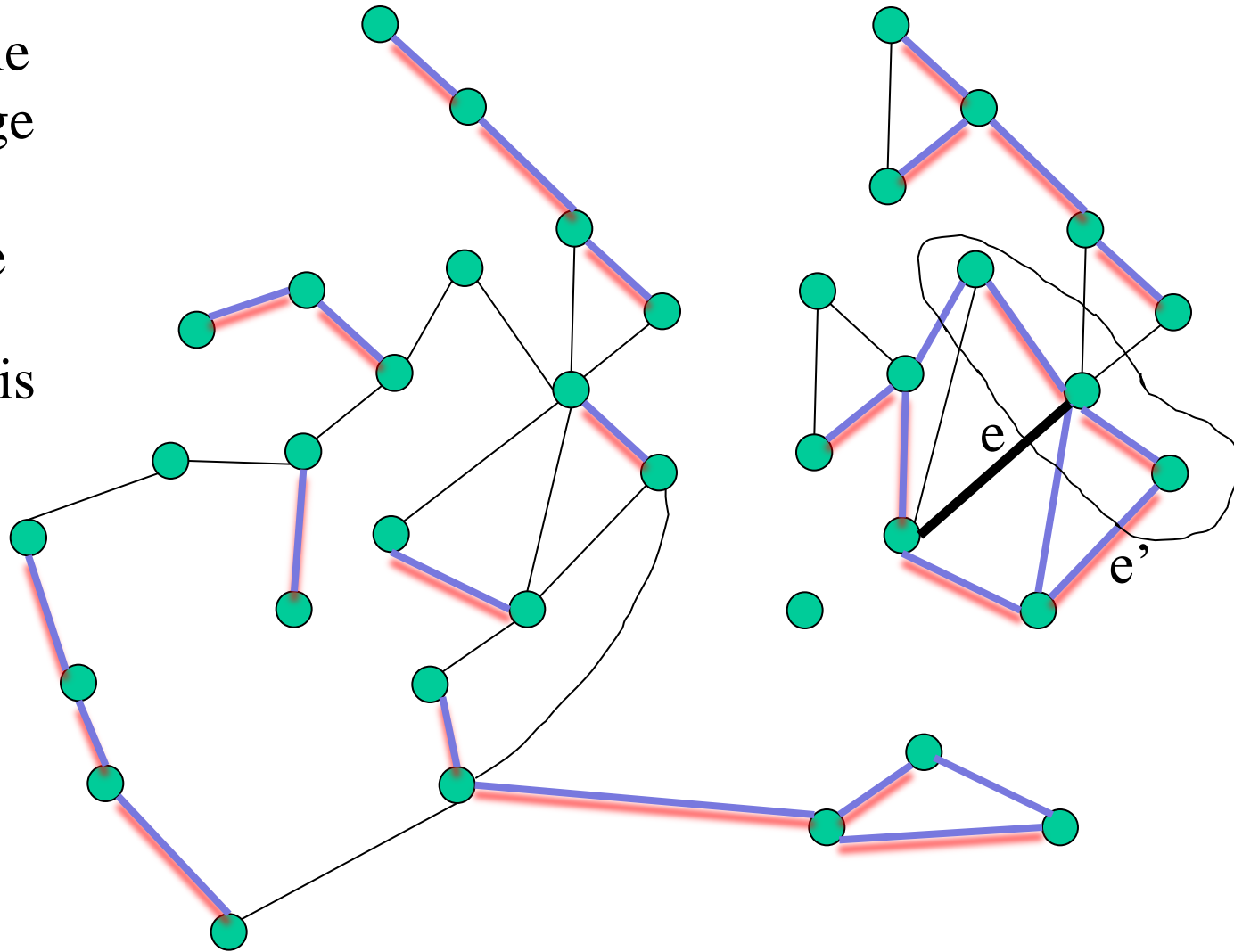




If  $e$  closes a cycle  
find the **blue** edge  
 $e'$  of maximum  
cost on the cycle

$\lambda_e = c(e) - c(e')$  is  
a critical value

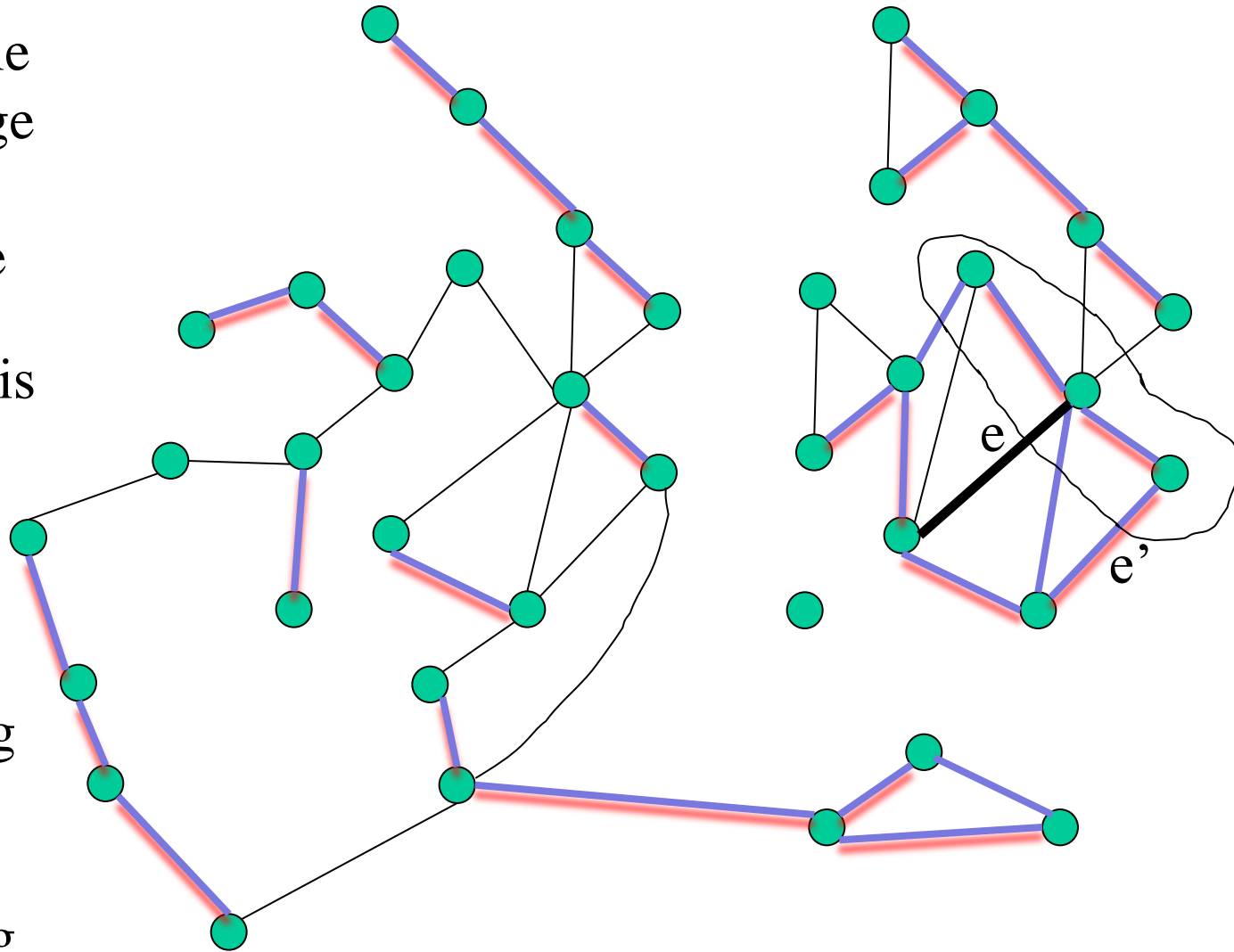
Consider the cut  
defined by  
removing  $e'$   
from the forest



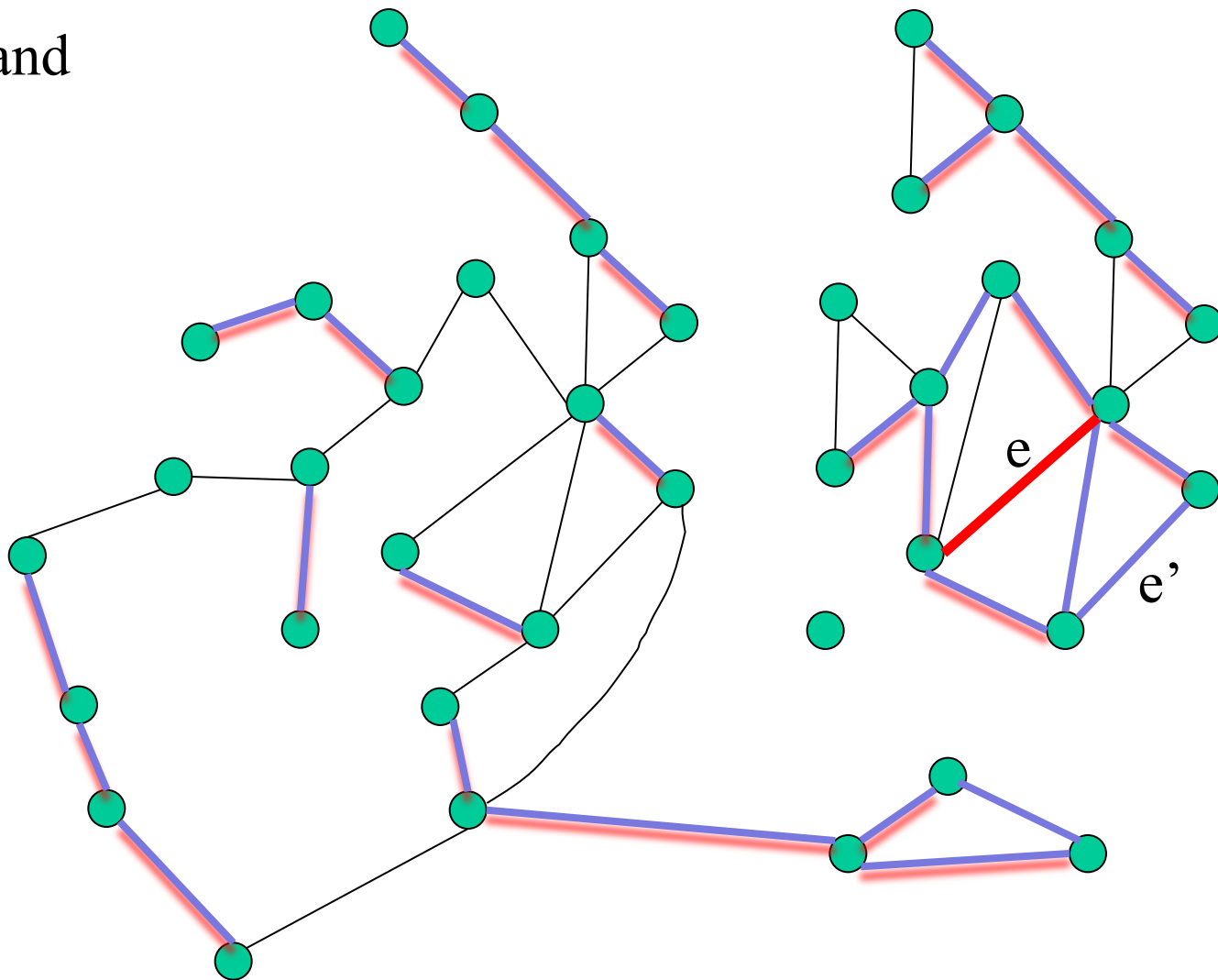
If  $e$  closes a cycle  
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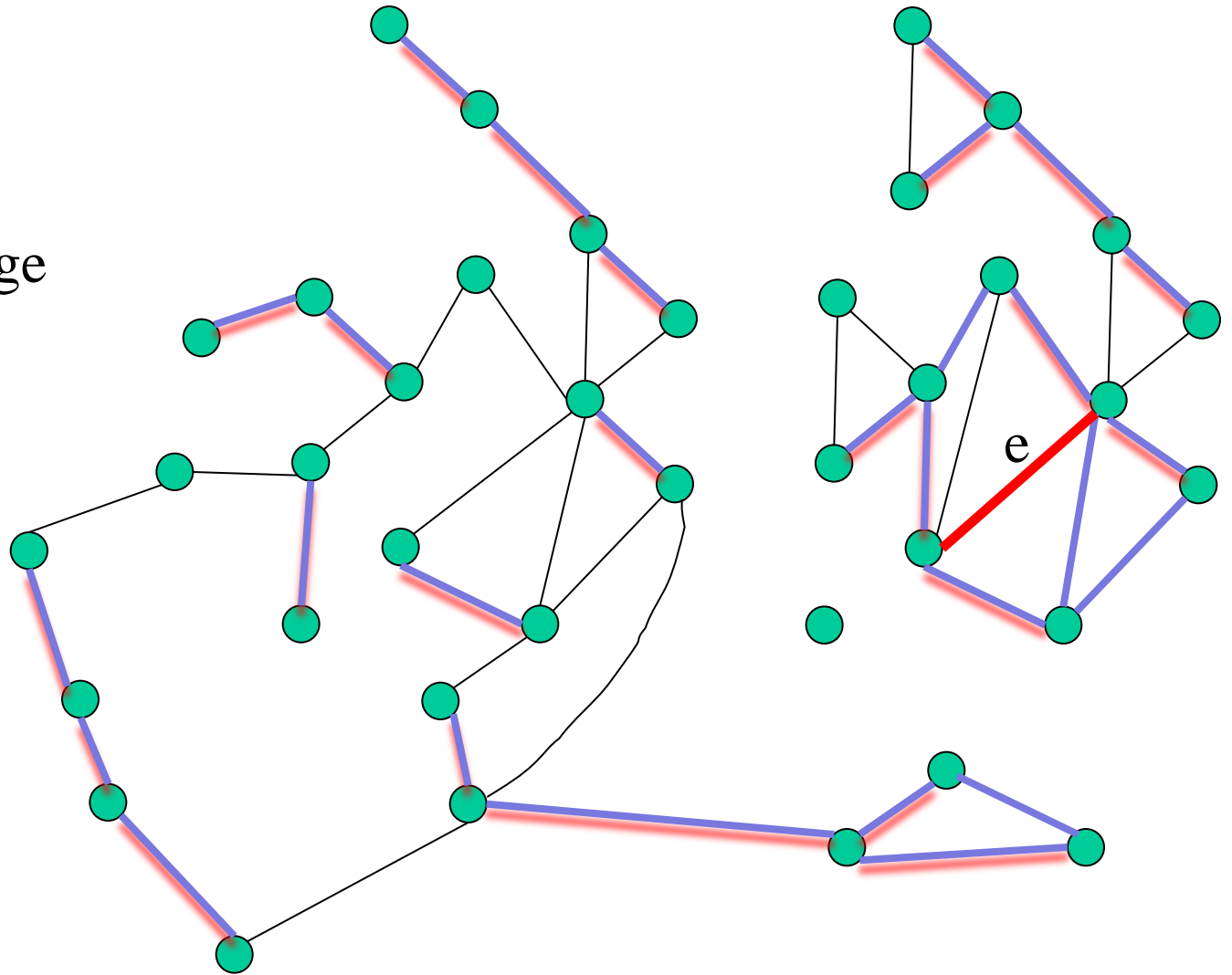
For  $\lambda < \lambda_e$  the  
edge  $e'$  is the  
smallest crossing  
it and for  $\lambda > \lambda_e$   
the edge  $e$  is the  
smallest crossing  
it



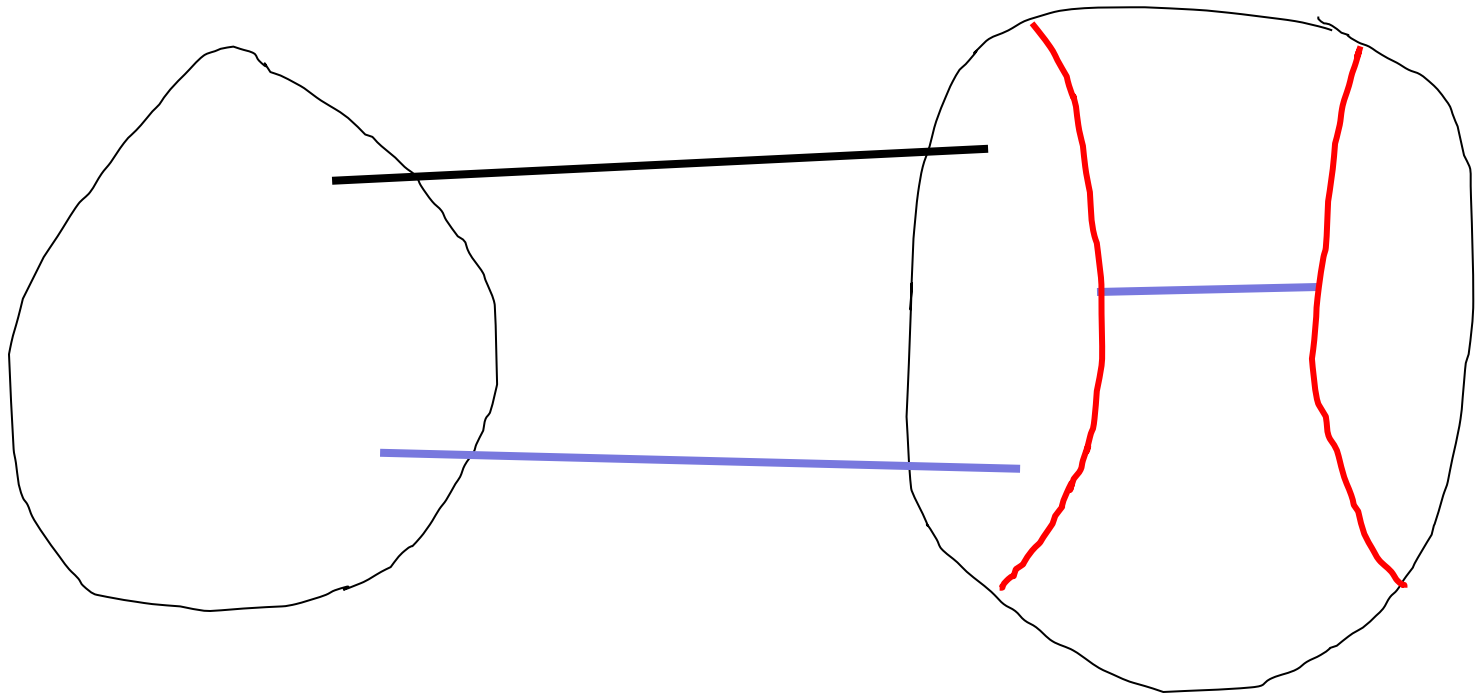
Replace  $e'$  by  $e$  and  
continue



Invariant: each blue edge of the forest is the smallest blue edge crossing the cut that it defines

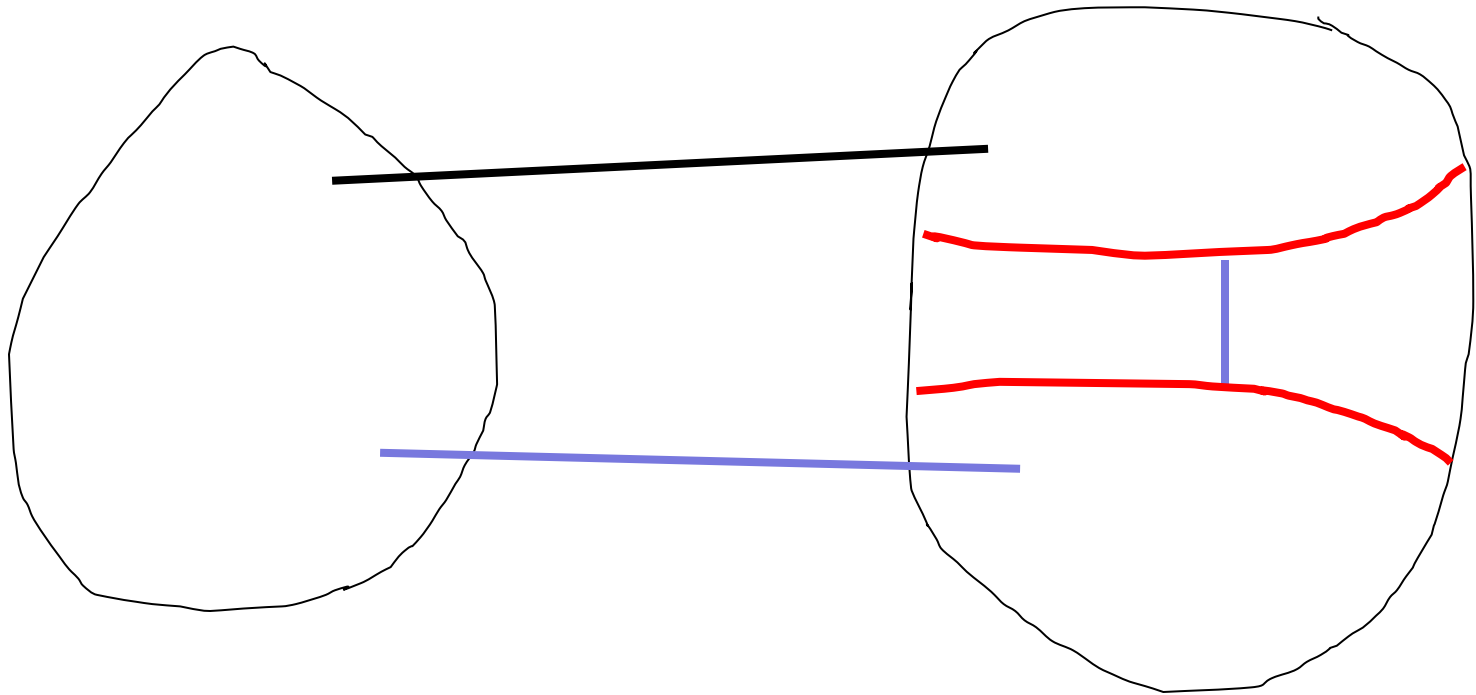


# Why is this invariant true ?



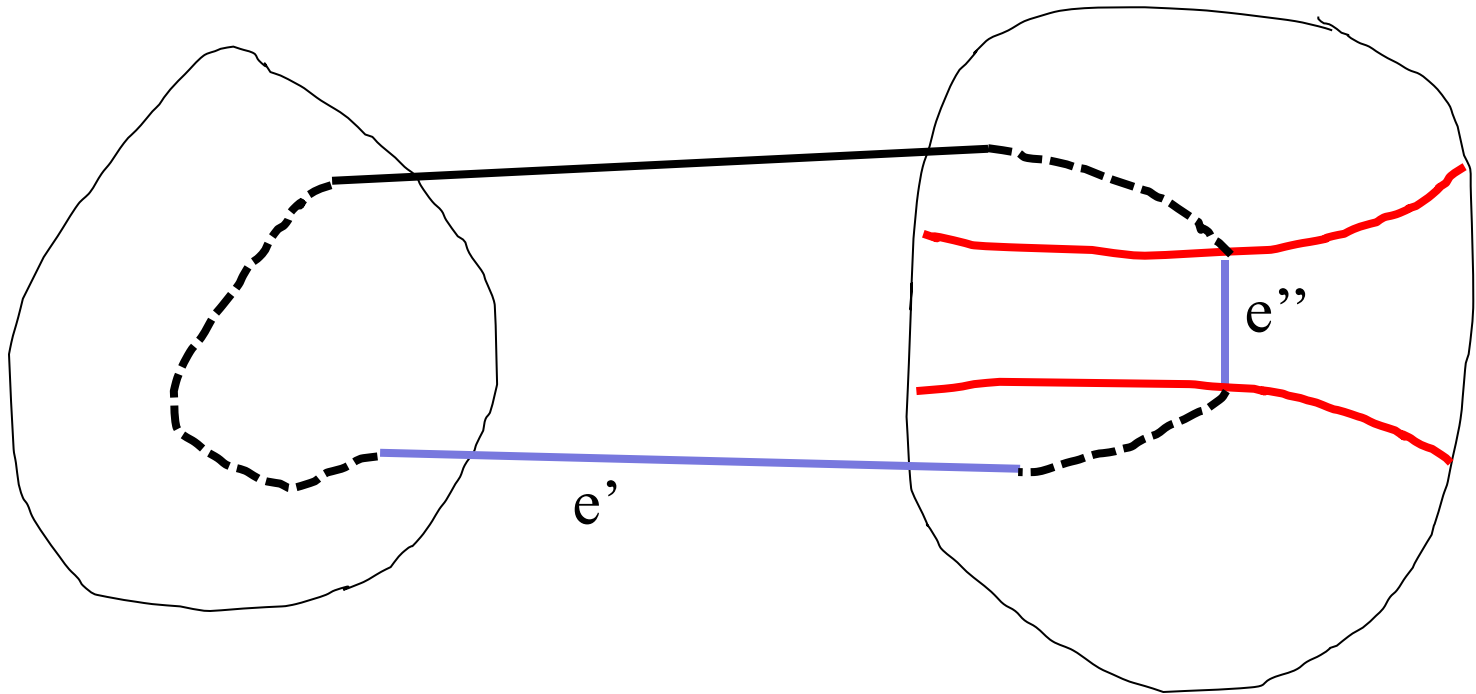
It is clear if the cut does not change

# Why is this invariant true ?



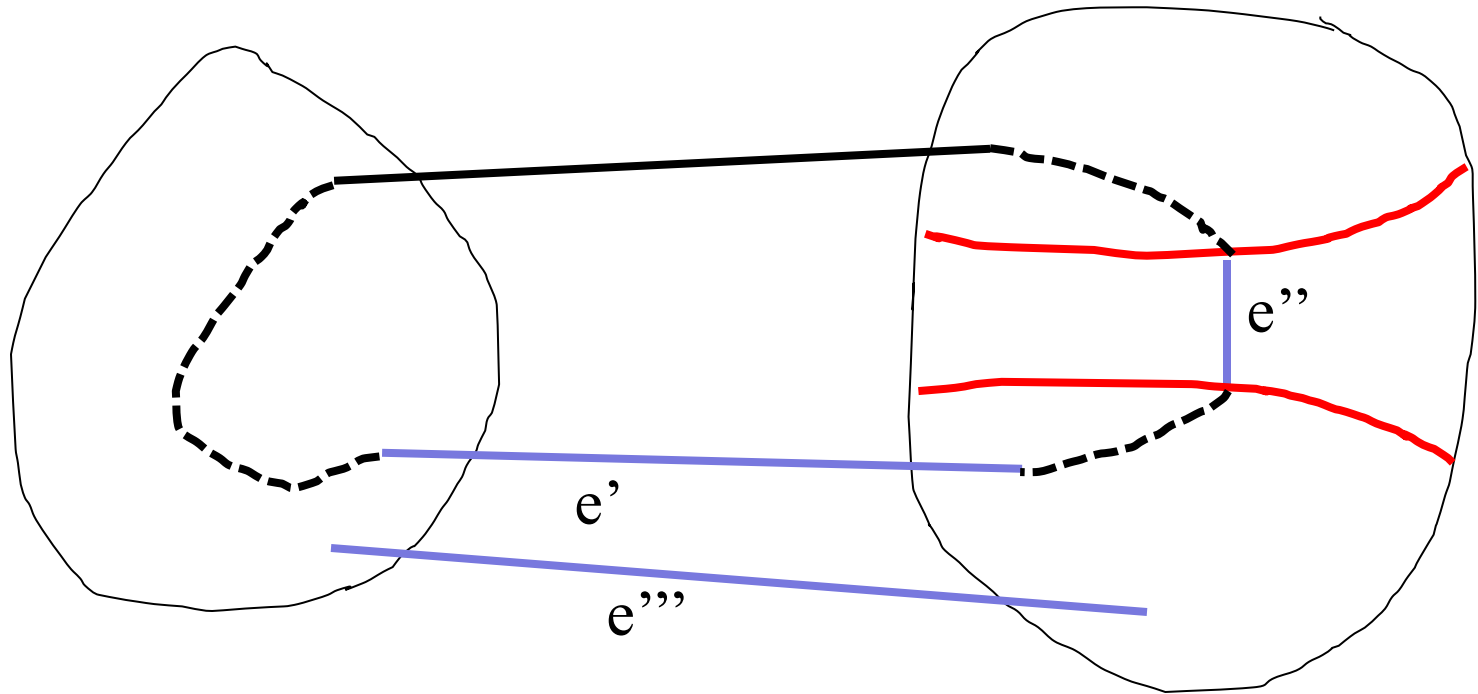
But the cut may change...

# Why is this invariant true ?



We have  $c(e'') \leq c(e')$

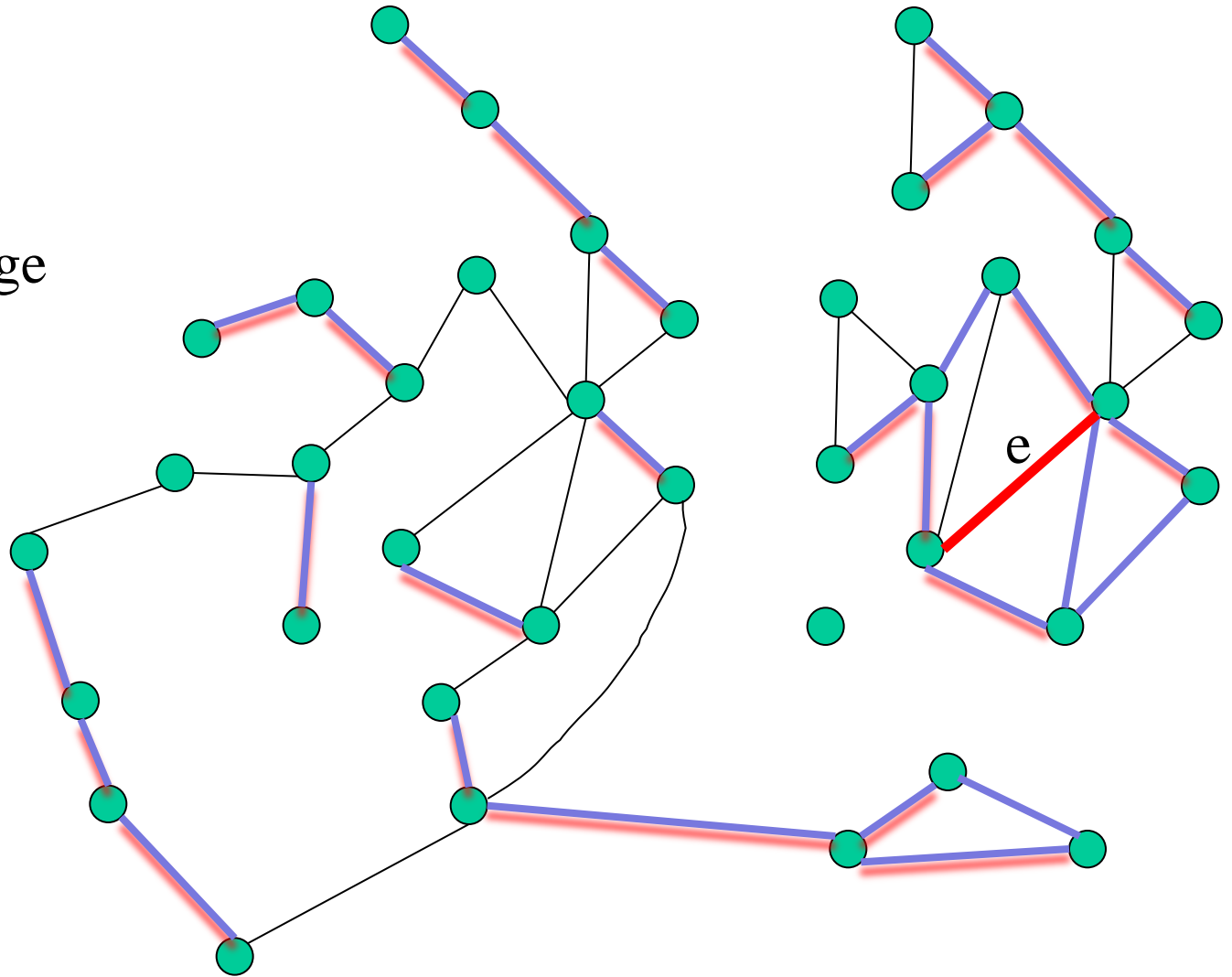
# Why is this invariant true ?



And  $c(e'') \leq c(e') \leq c(e''')$

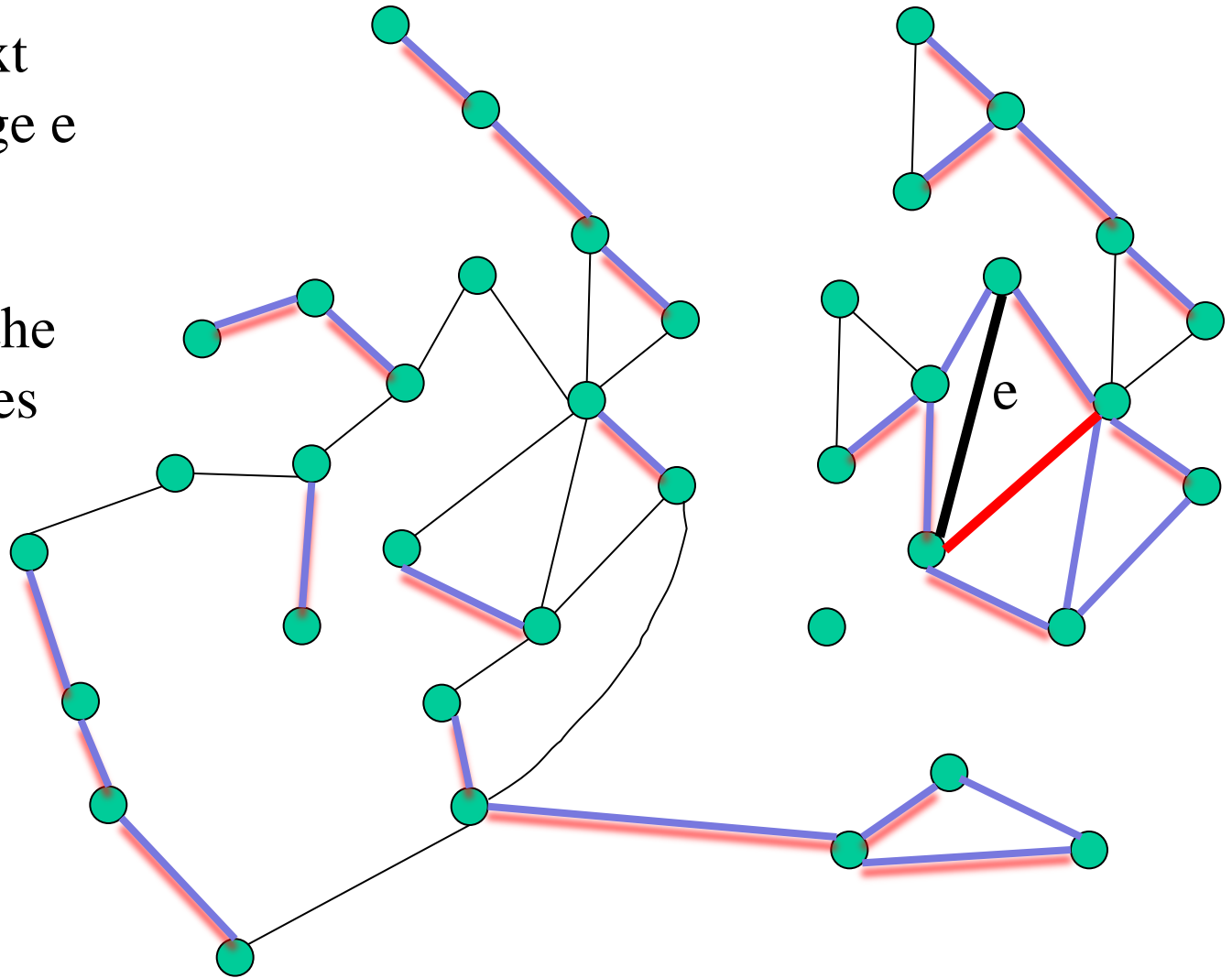


Invariant: each blue edge of the forest is the smallest blue edge crossing the cut that it defines



Consider the next largest black edge  $e$

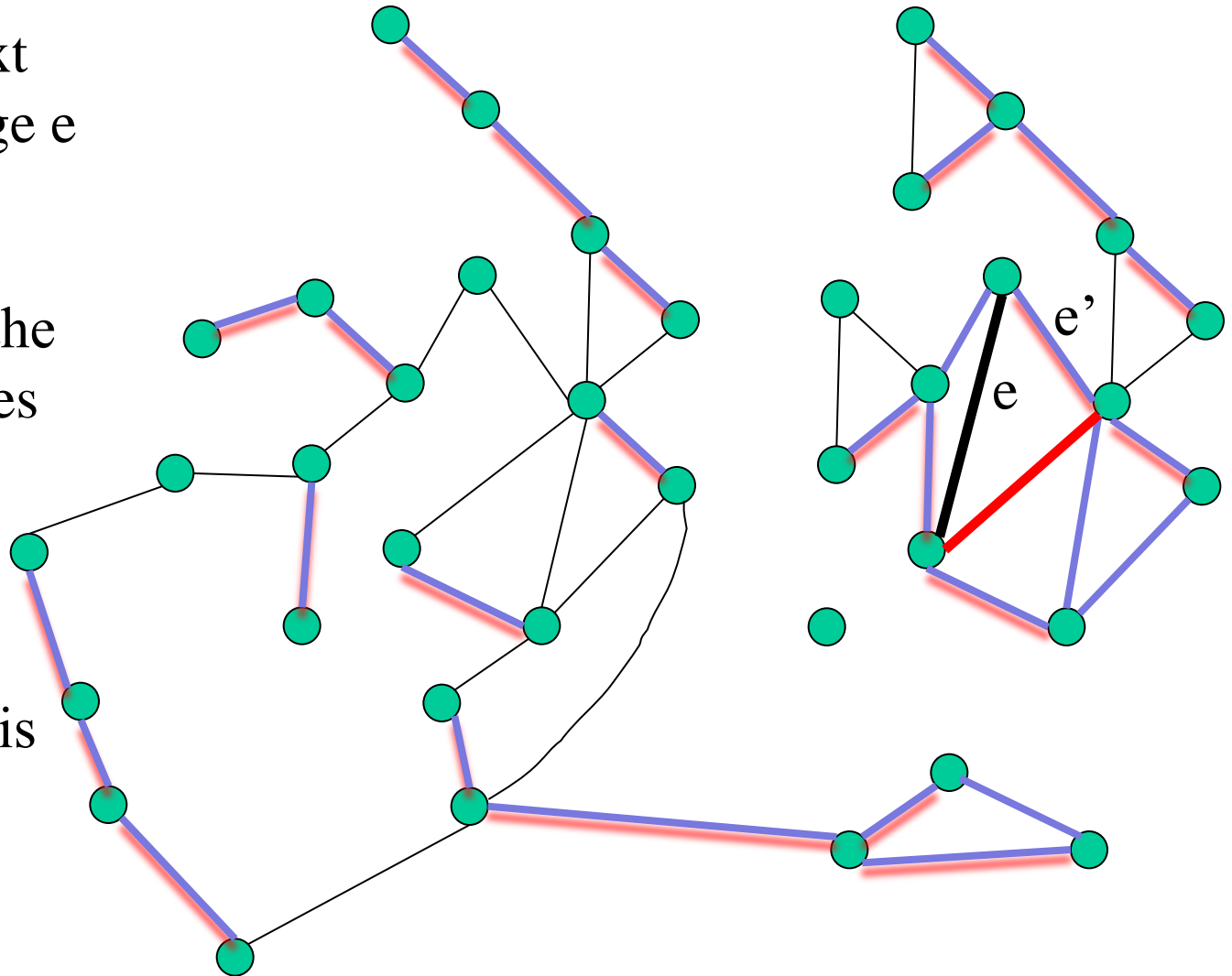
Find the largest blue edge  $e'$  on the cycle that  $e$  closes with the current forest



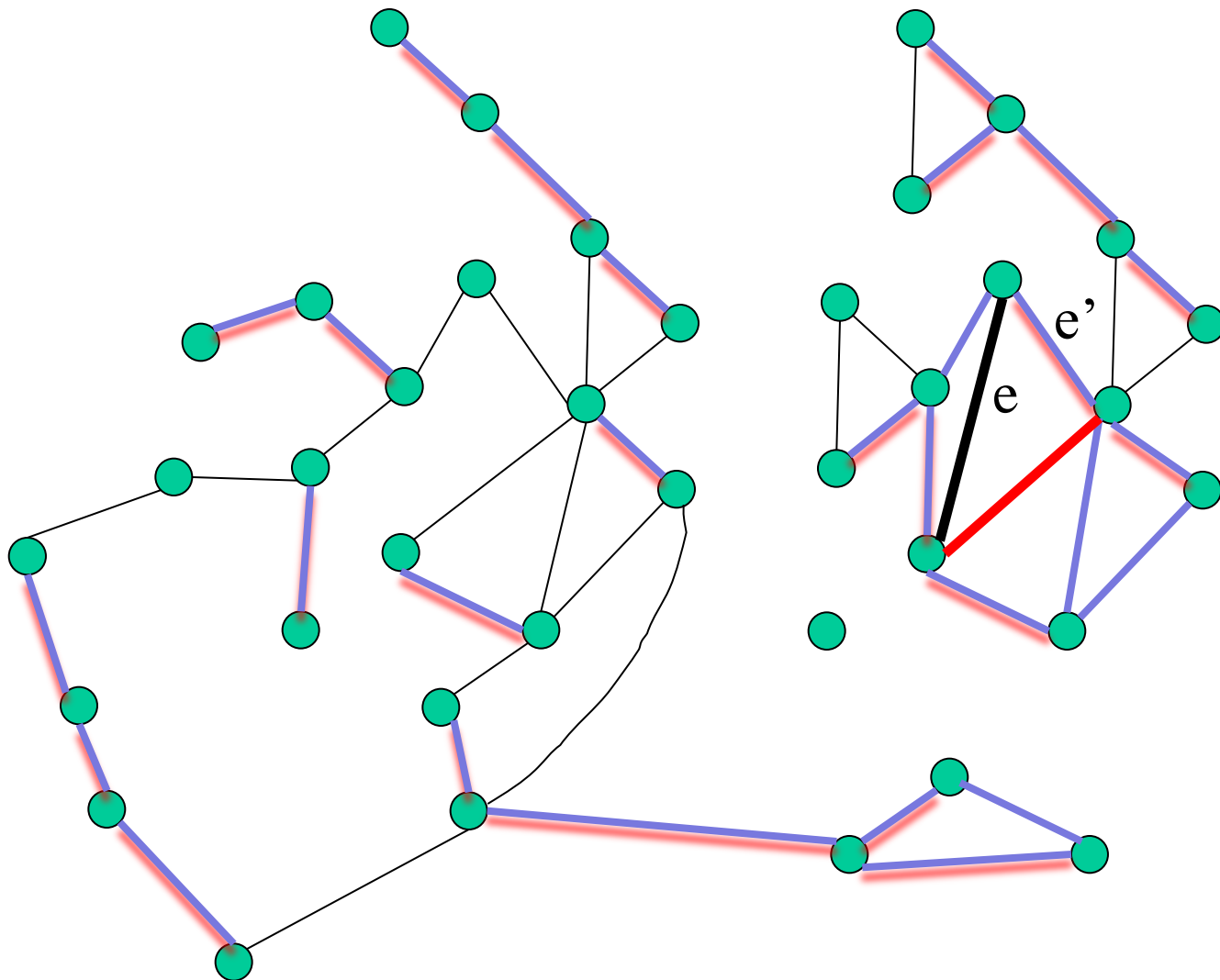
Consider the next largest black edge  $e$

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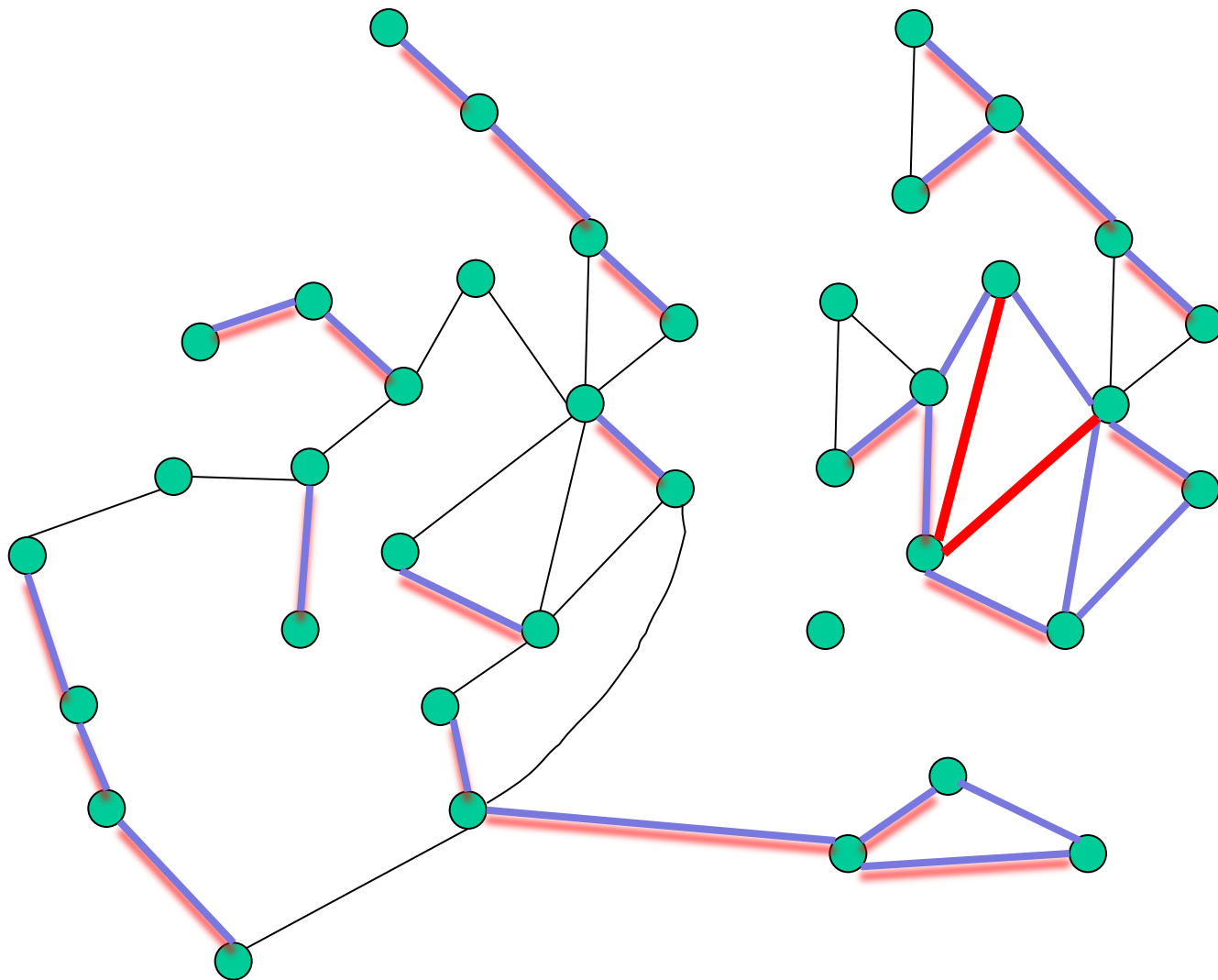
$\lambda_e = c(e) - c(e')$  is a critical value



Replace  $e'$  by  $e$   
and continue



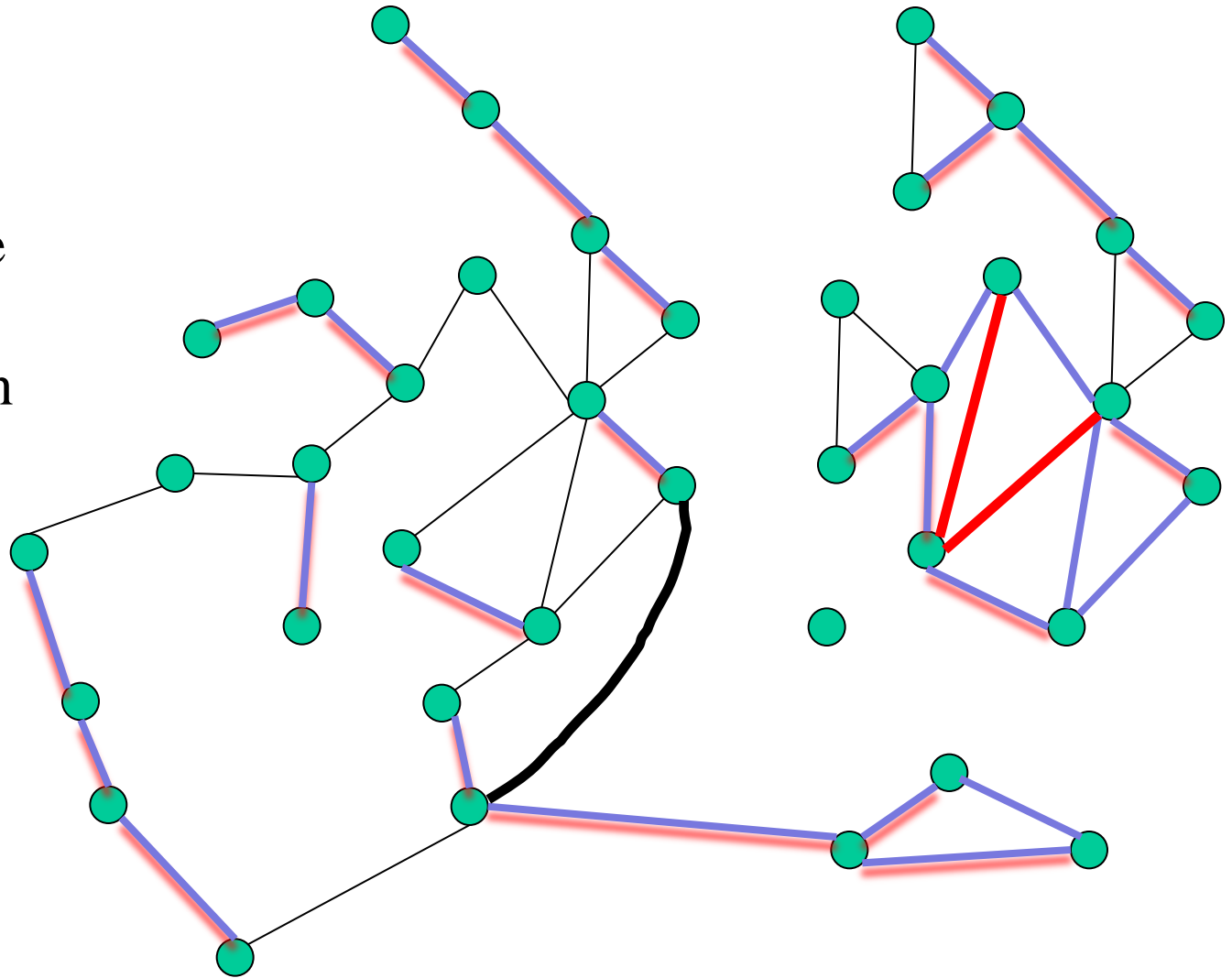
Replace  $e'$  by  $e$   
and continue



Replace  $e'$  by  $e$   
and continue

If the black edge  
connects two  
components then  
it appears in any  
spanning forest

Add it and  
continue



- If a black edge closes a cycle of black edges just discard it

# Summary

- We identify a set of blue edges that are never in the tree
- We identify a set of black edges always in the tree (say  $b$  many)
- Other edges are partitioned into black-blue pairs each with an associated critical  $\lambda$
- Sort the pairs by  $\lambda$
- If you want  $b + z$  black edges then take the black edges of the first  $z$  pairs and the blue edges of the rest
- $O(m \log(n))$  total time

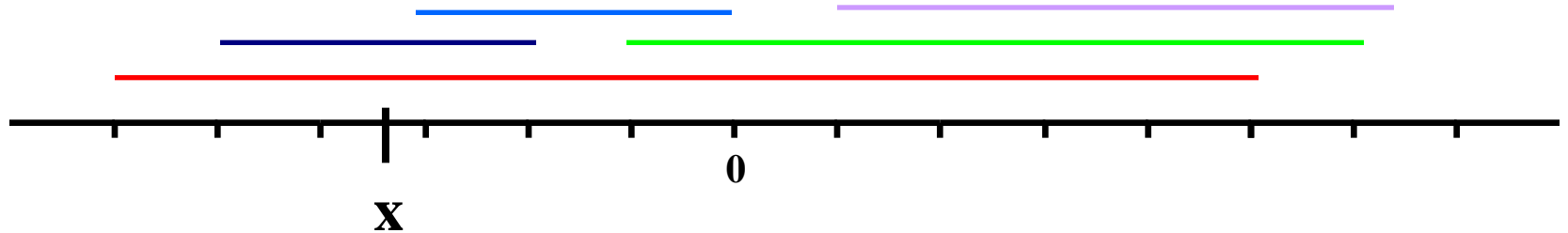


# Application (3)

# 1D Range reporting

Given a set of intervals  $S$  on the line, preprocess them to build a structure that allows efficient queries of the form:

Given a point  $x$  find all intervals containing it.

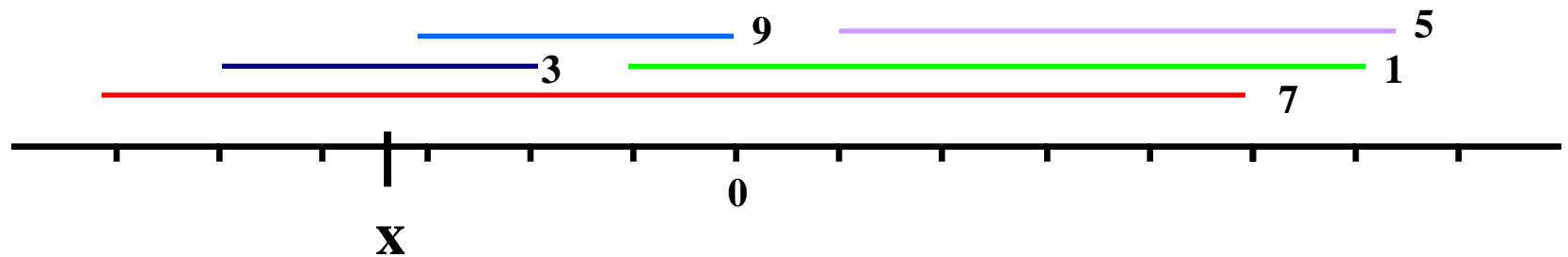


# Dynamic range reporting + priorities

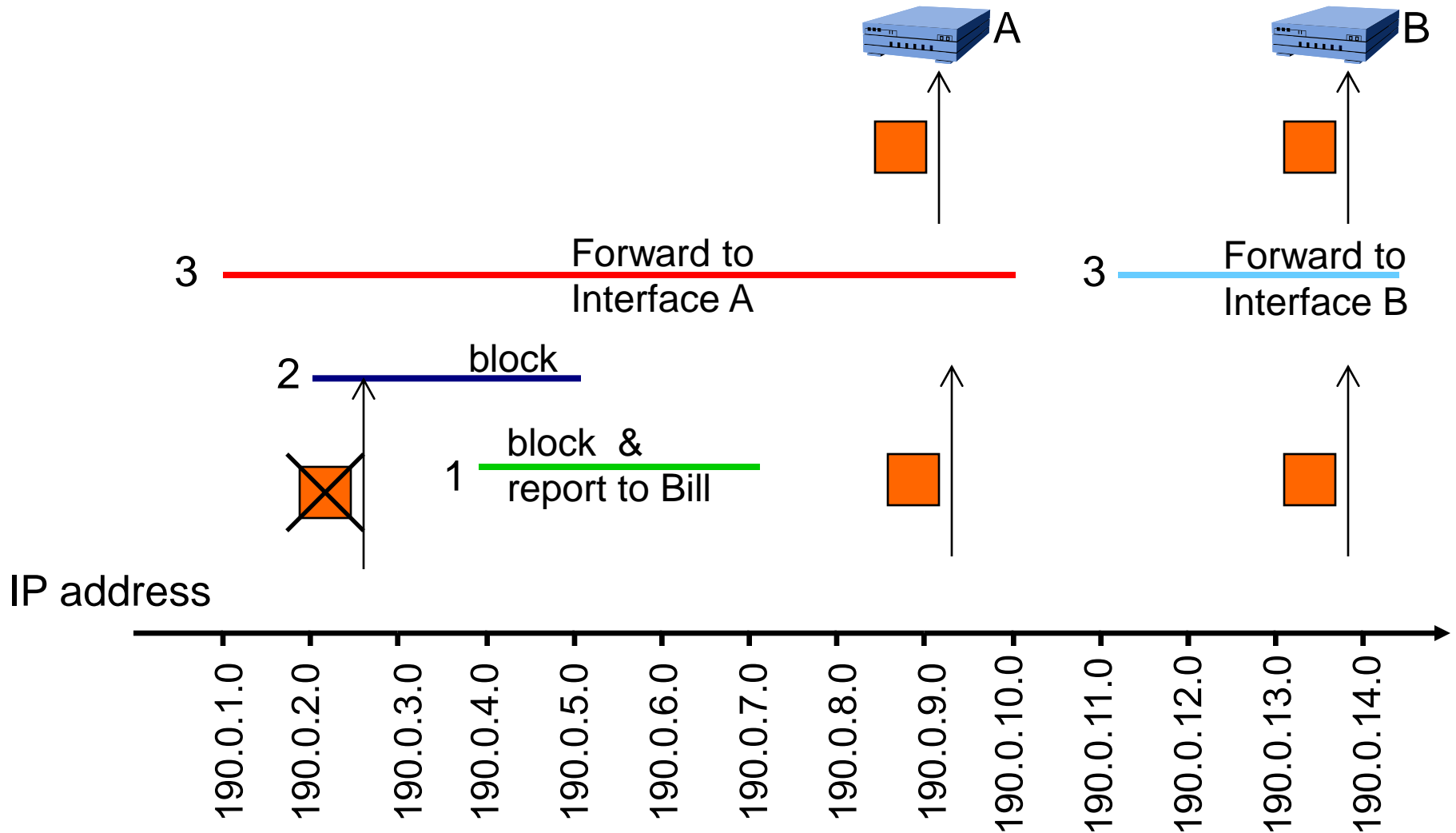
Given a set of intervals  $S$  on the line, each with priority assigned to it, build a structure that allows efficient queries of the form:

Given a point  $x$  find interval with minimum priority containing it.

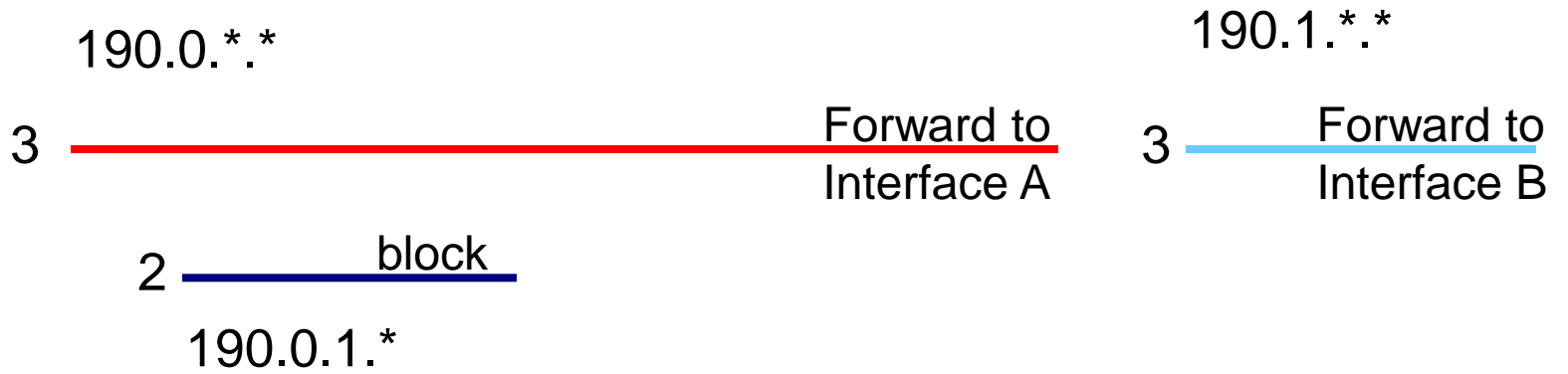
Updates – insert or delete an interval



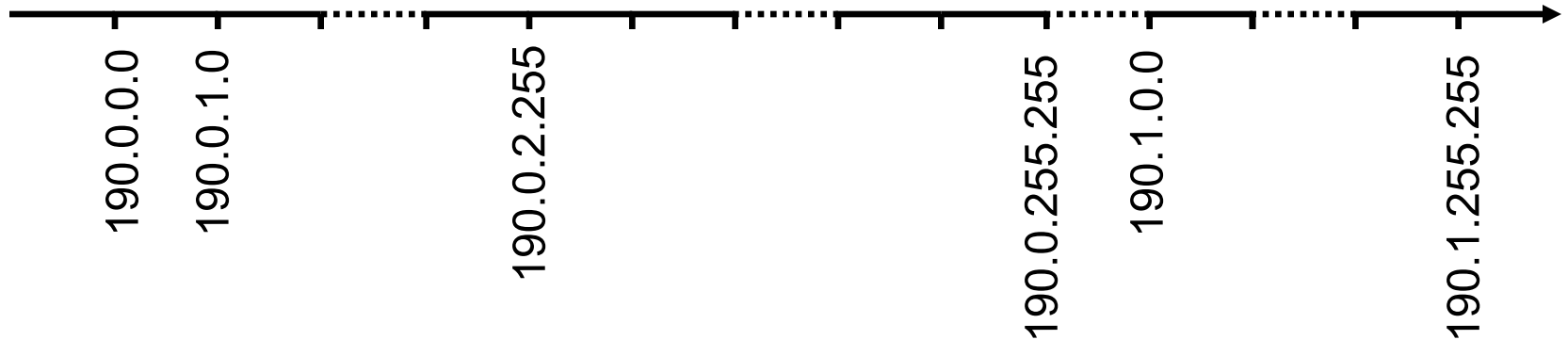
# Motivation – Packet classification



# Nested intervals, IP prefixes

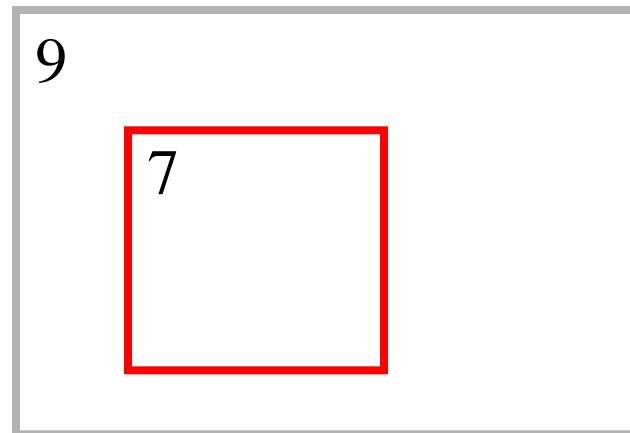
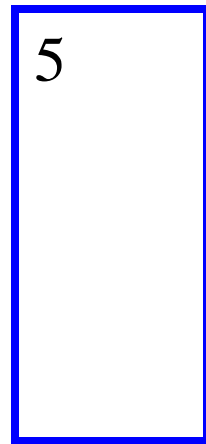


IP address

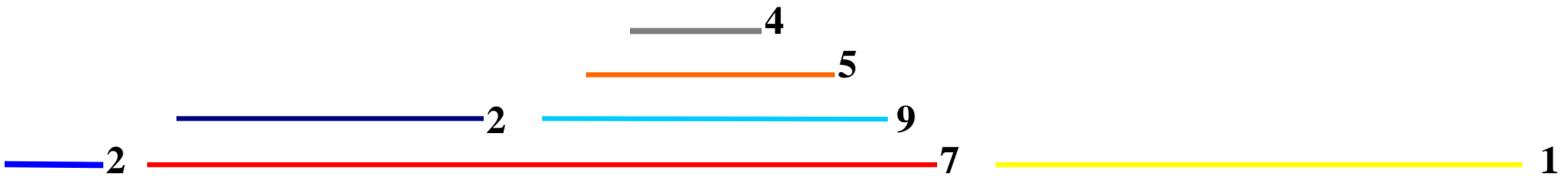


# Extension to 2D

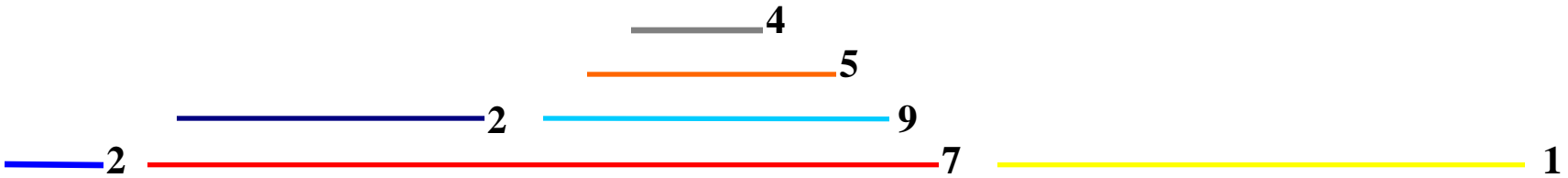
- Query = point in  $\mathbb{R}^2$ 
  - (Sender IP, receiver IP)
- interval = rectangle with priority



# One dimensional data structure for nested intervals

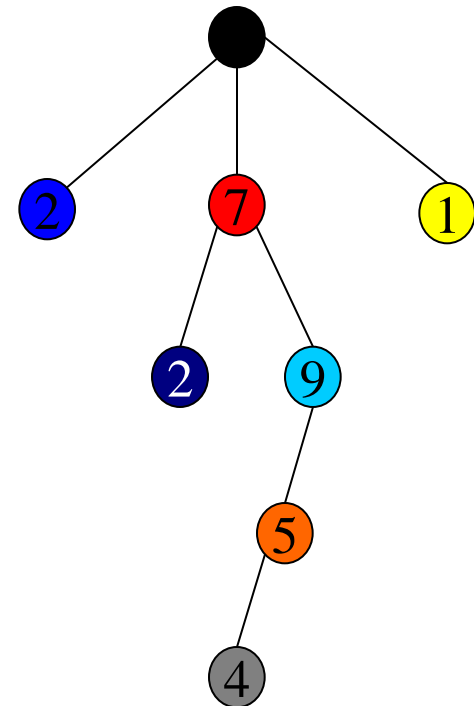


# Nested Intervals



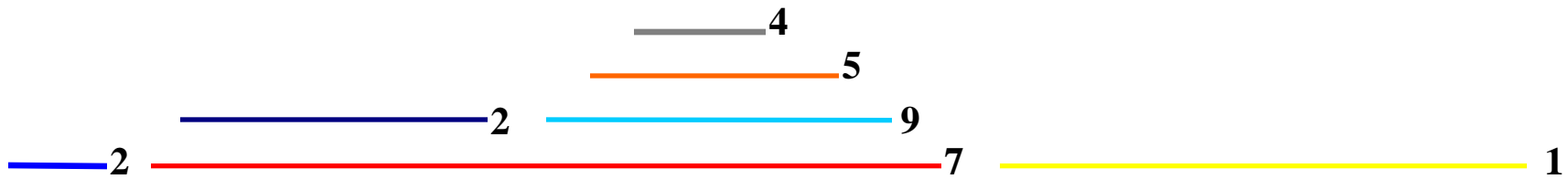
## Containment tree:

The parent of interval  $v$  is the smallest interval containing  $v$





# Nested Intervals

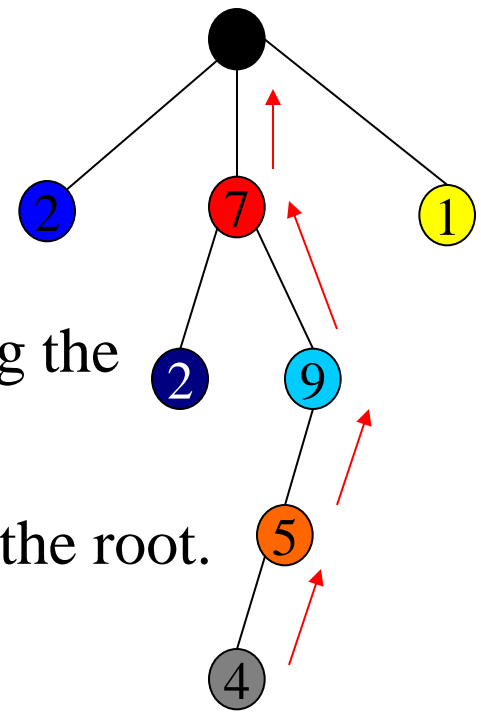


## Query:

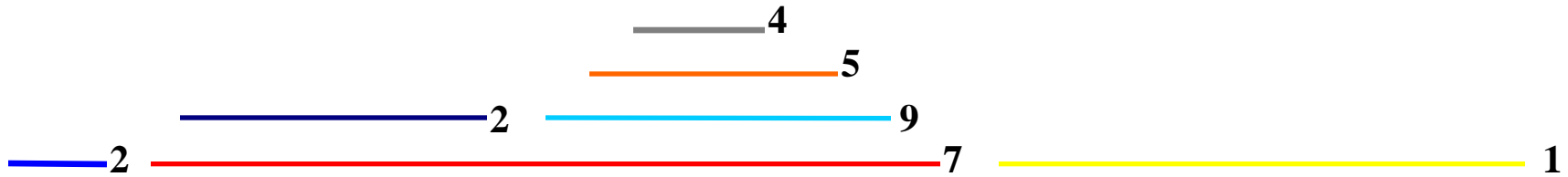
Starting node  $s$  = smallest interval containing the query point

Relevant priorities are on the path from  $s$  to the root.

**Problem:** path may be long...

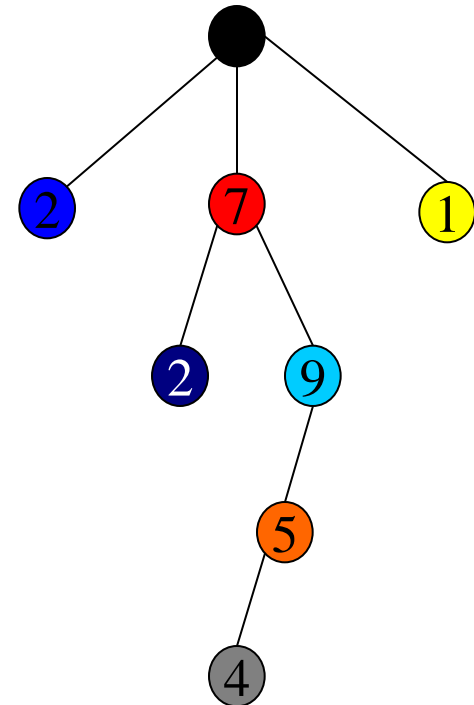


# Hey, dynamic trees know how to do that

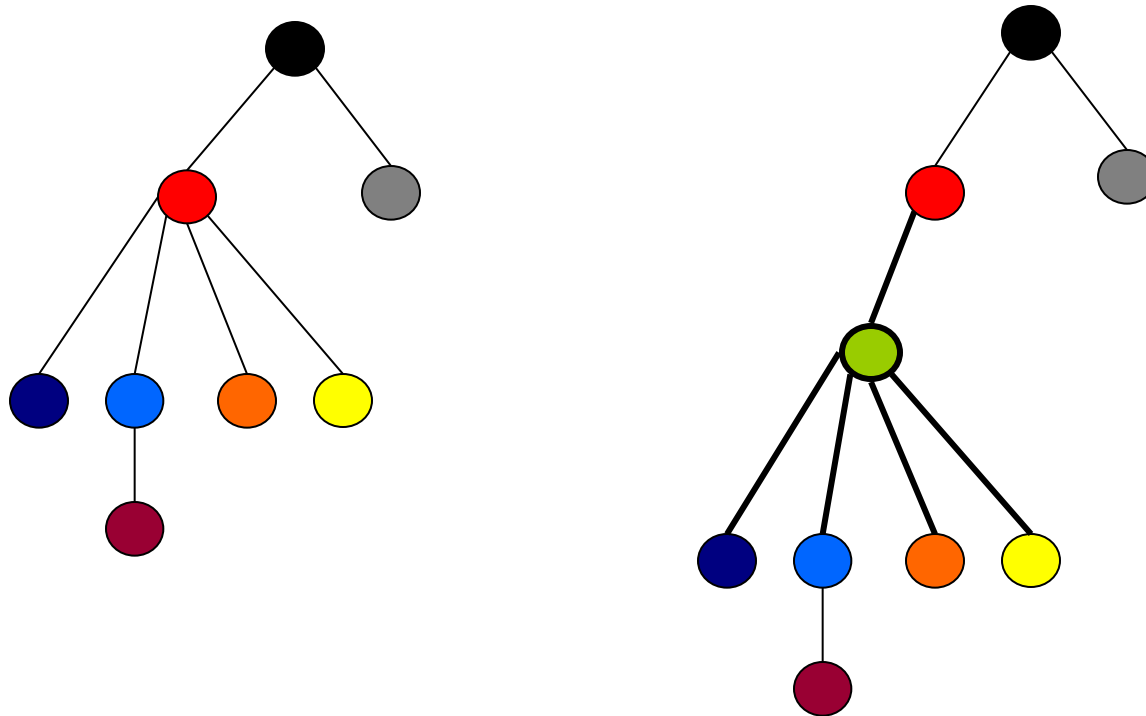
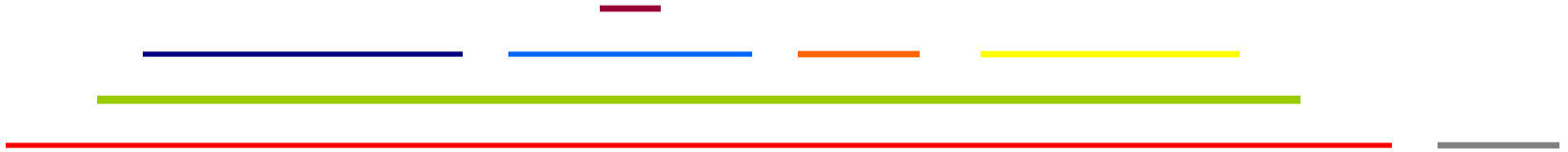


We can use a dynamic tree to represent the containment tree.

Query  $\rightarrow$  mincost()

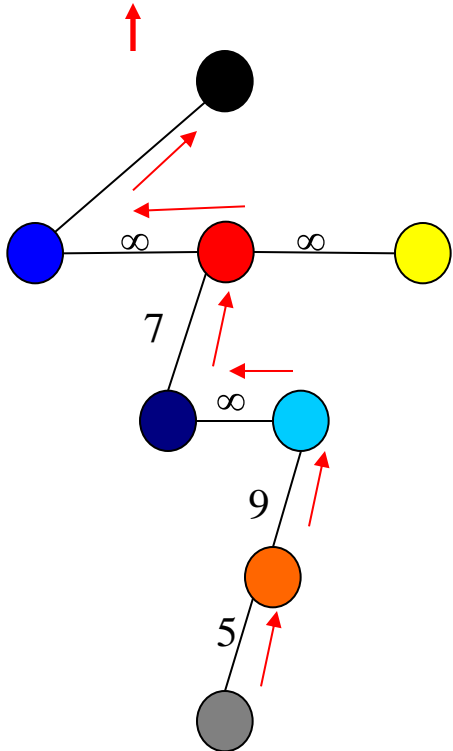
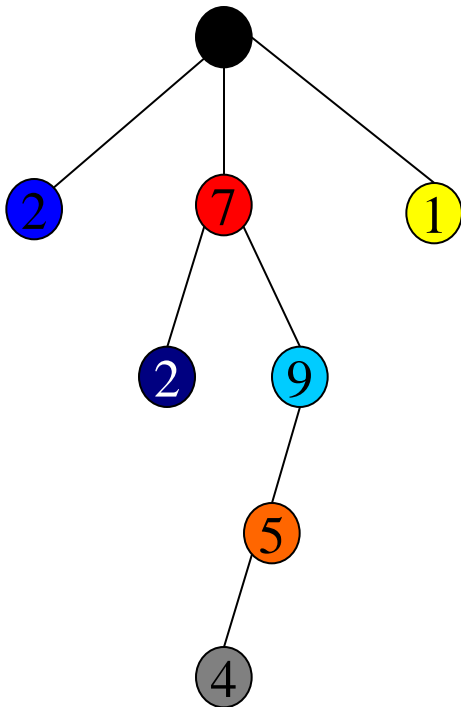
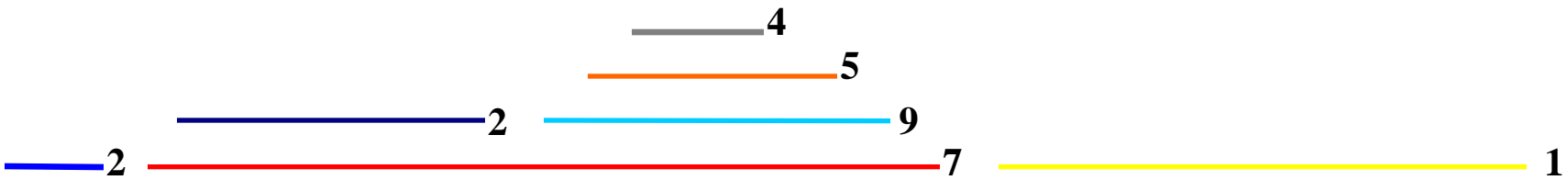


# Insert



**Problem:** Updates  $\Rightarrow$  Many cuts & links

# Binarization



Node  $v \Rightarrow$  node  $v$

Leftmost child of  $v \Rightarrow$  Left child of  $v$

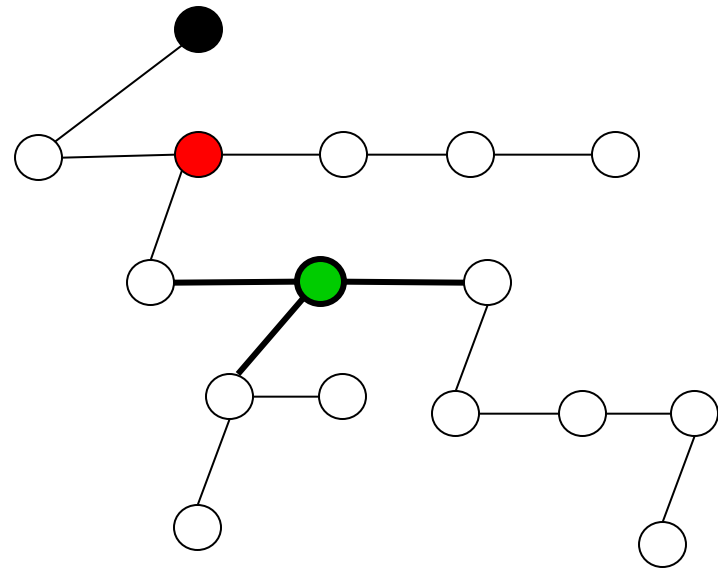
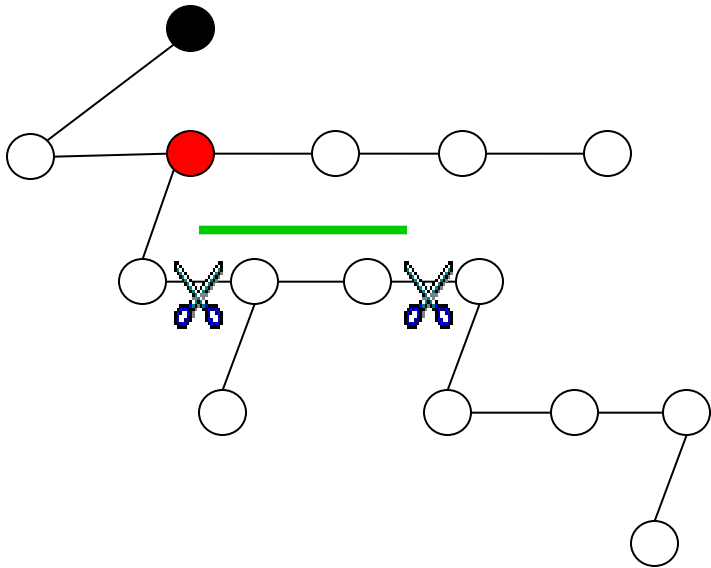
Any other child of  $v \Rightarrow$  right child of its left sibling

Adjust costs:

Left edge  $\Rightarrow$  priority of parent

Right edge  $\Rightarrow \infty$

# Insert (Cont.)



Constant number of links and cuts

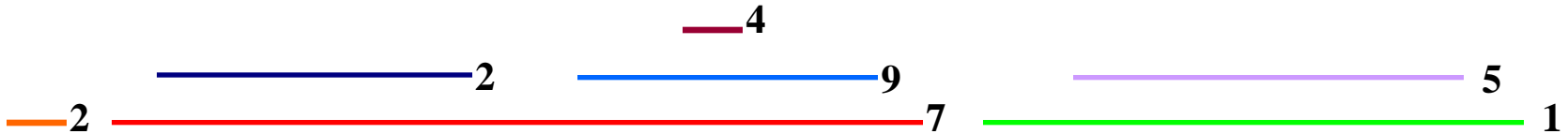
# Summary

- Containment tree C

Query = min cost on path from starting point to –  
root

- Represent C by binarized version B
- Represent B by dynamic tree D
- How do you find the point to start the query ?
- How do you find the edges to cut ?

# How do you start the query ?

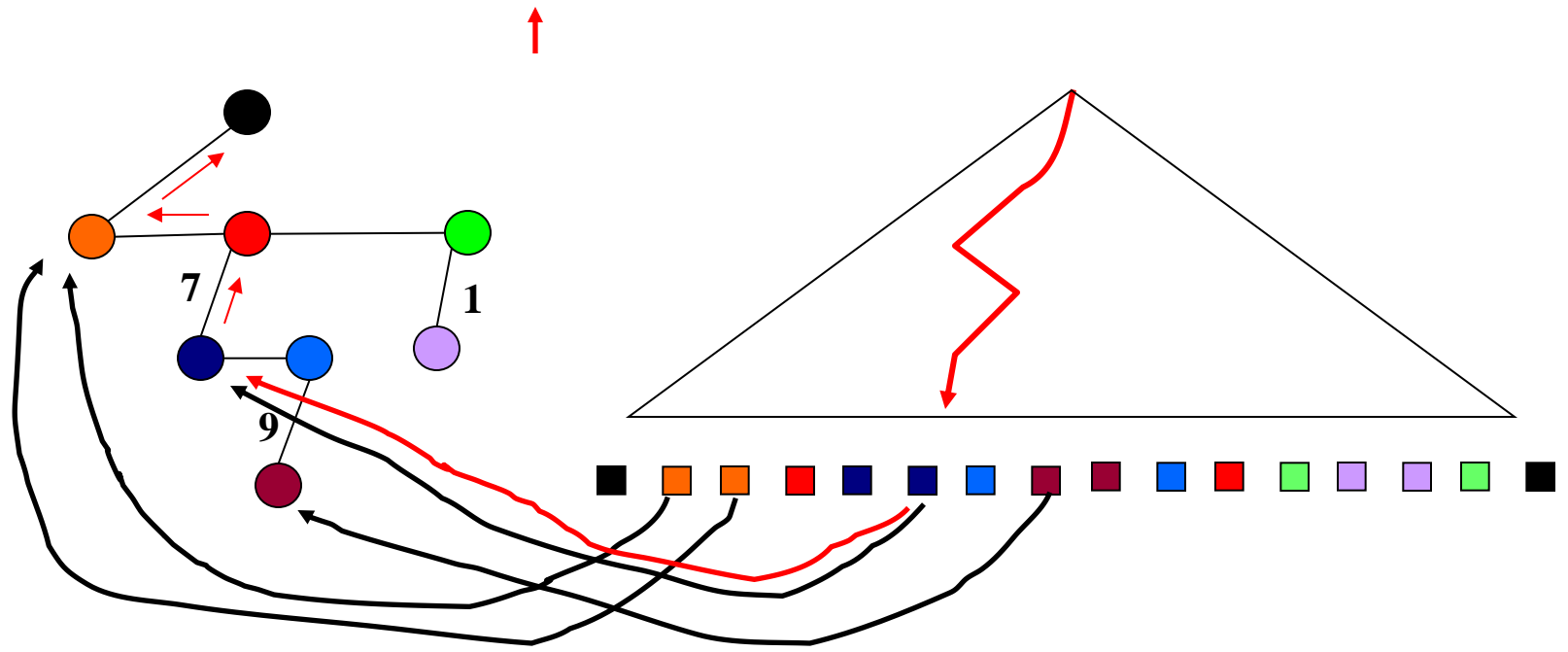
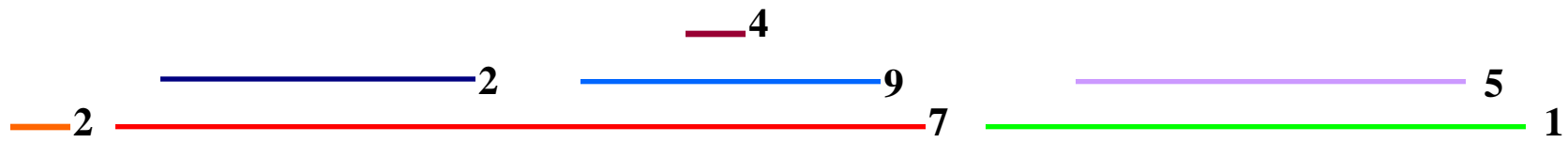


↑ Use a balanced search tree on the endpoints



$\text{Min}(\text{Mincost}(\bullet), \text{pri}(\bullet))$

# query (cont)



Mincost(●)



# Lets implement this data type

`maketree(v)`

`w = findroot(v)`

`(w,c) = mincost(v)`

`addcost(v,c)`

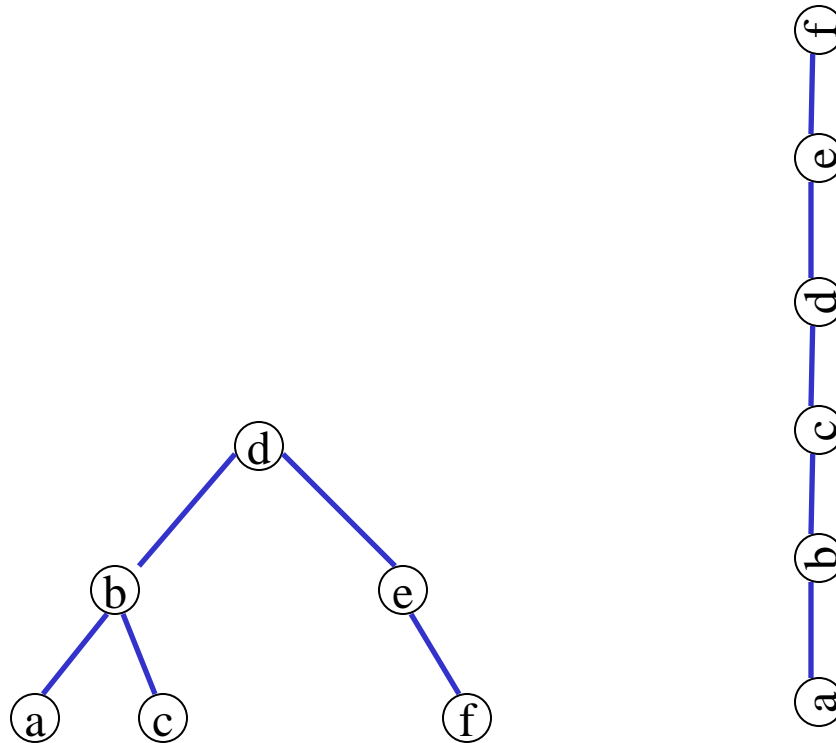
`link(v,w,c)`

`cut(v)`

`evert(v)`

# Simple case -- paths

Assume for a moment that each tree  $T$  in the forest is a path.  
We represent it by a virtual tree which is a simple splay tree.



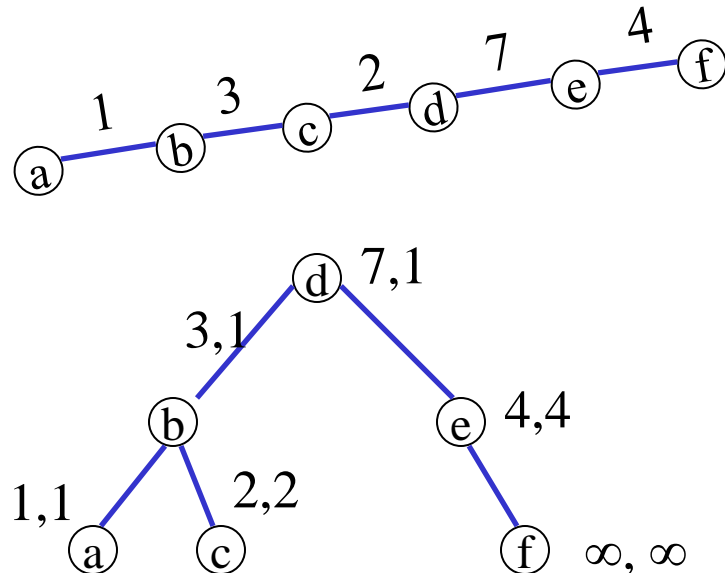
# Findroot( $v$ )

Splay at  $v$ , then follow right pointers until you reach the last vertex  $w$  on the right path. Return  $w$  and splay at  $w$ .

# Mincost(v)

With every vertex  $x$  we record  $\text{cost}(x)$  = the cost of the edge  $(x, p(x))$

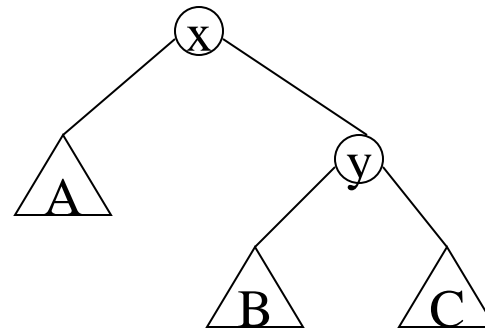
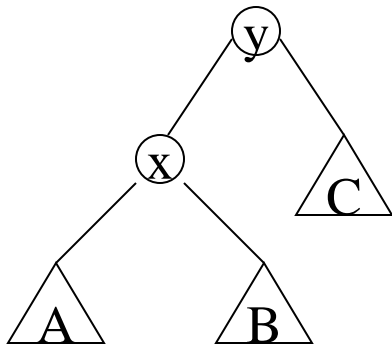
We also record with each vertex  $x$   $\text{mincost}(x)$  = minimum of  $\text{cost}(y)$  over all descendants  $y$  of  $x$ .



# Mincost(v)

Splay at  $v$  and use mincost values to search for the minimum

Notice: we need to update mincost values as we do rotations.

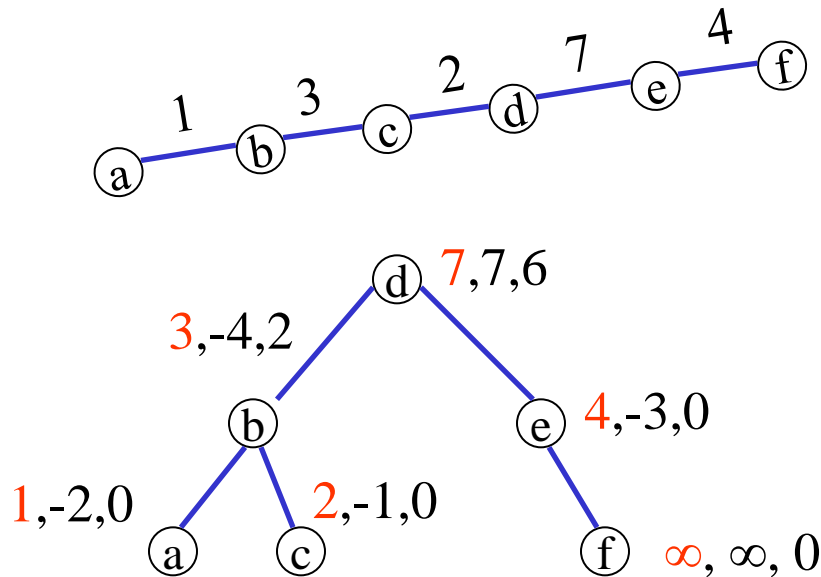


# Addcost(v,c)

Rather than storing  $\text{cost}(x)$  and  $\text{mincost}(x)$  we will store

$$\Delta\text{cost}(x) = \text{cost}(x) - \text{cost}(p(x))$$

$$\Delta\text{min}(x) = \text{cost}(x) - \text{mincost}(x)$$



**Addcost(v,c) :**

Splay at  $v$ ,

$$\Delta\text{cost}(v) += c$$

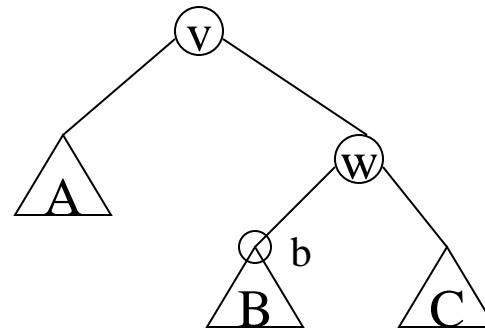
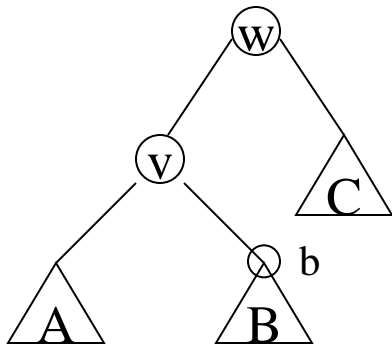
$$\Delta\text{cost}(\text{left}(v)) -= c$$

similarly update

$\Delta\text{min}$

# Addcost(v,c) (cont)

Notice that now we have to update  $\Delta\text{cost}(x)$  and  $\Delta\text{min}(x)$  through rotations



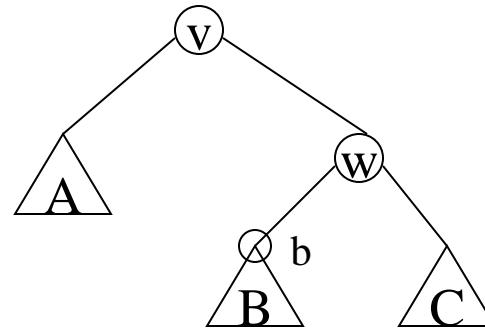
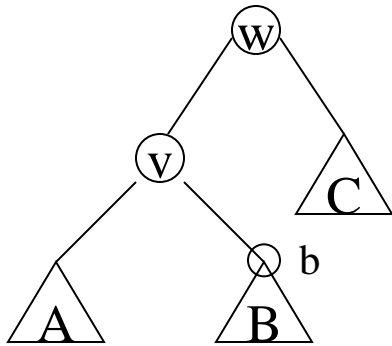
$$\Delta\text{cost}'(v) = \Delta\text{cost}(v) + \Delta\text{cost}(w)$$

$$\Delta\text{cost}'(w) = -\Delta\text{cost}(v)$$

$$\Delta\text{cost}'(b) = \Delta\text{cost}(v) + \Delta\text{cost}(b)$$

# Addcost(v,c) (cont)

Update  $\Delta_{\min}$ :



$$\Delta_{\min}'(w) = \max \{0, \Delta_{\min}(b) - \Delta_{\text{cost}}'(b), \Delta_{\min}(c) - \Delta_{\text{cost}}(c)\}$$

$$\Delta_{\min}'(v) = \max \{0, \Delta_{\min}(a) - \Delta_{\text{cost}}(a), \Delta_{\min}'(w) - \Delta_{\text{cost}}'(w)\}$$



# Link(v,w,c), cut(v)

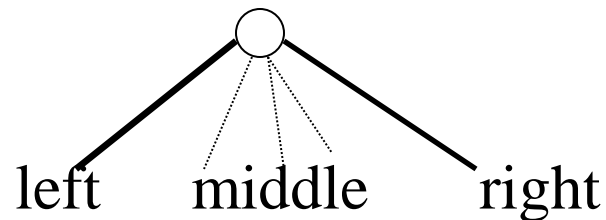
Translate directly into catenation and split of splay trees if we talk about paths.

Lets do the general case now.

# The virtual tree

- We represent each tree  $T$  by a virtual tree  $V$ .

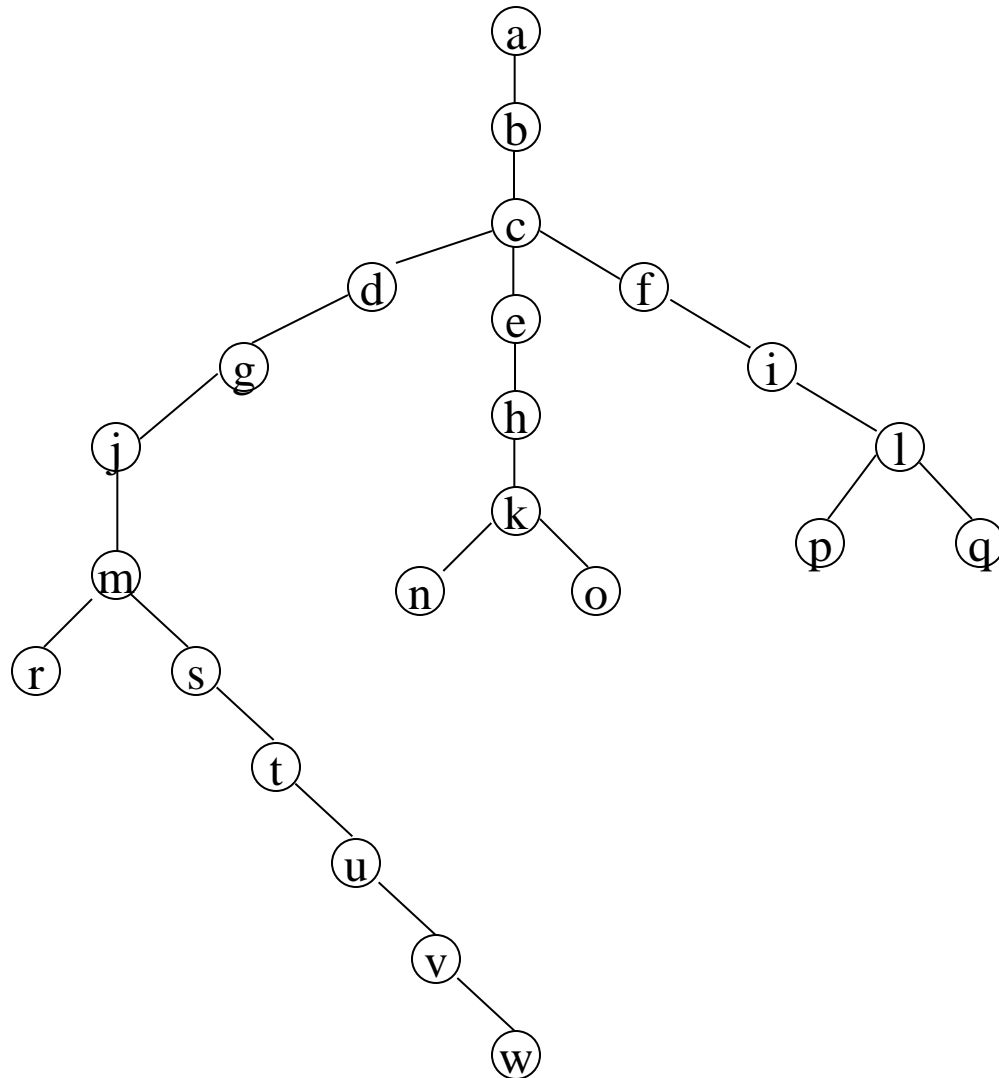
The virtual tree is a binary tree with middle children.



Think of  $V$  as partitioned into **solid subtrees** connected by dashed edges

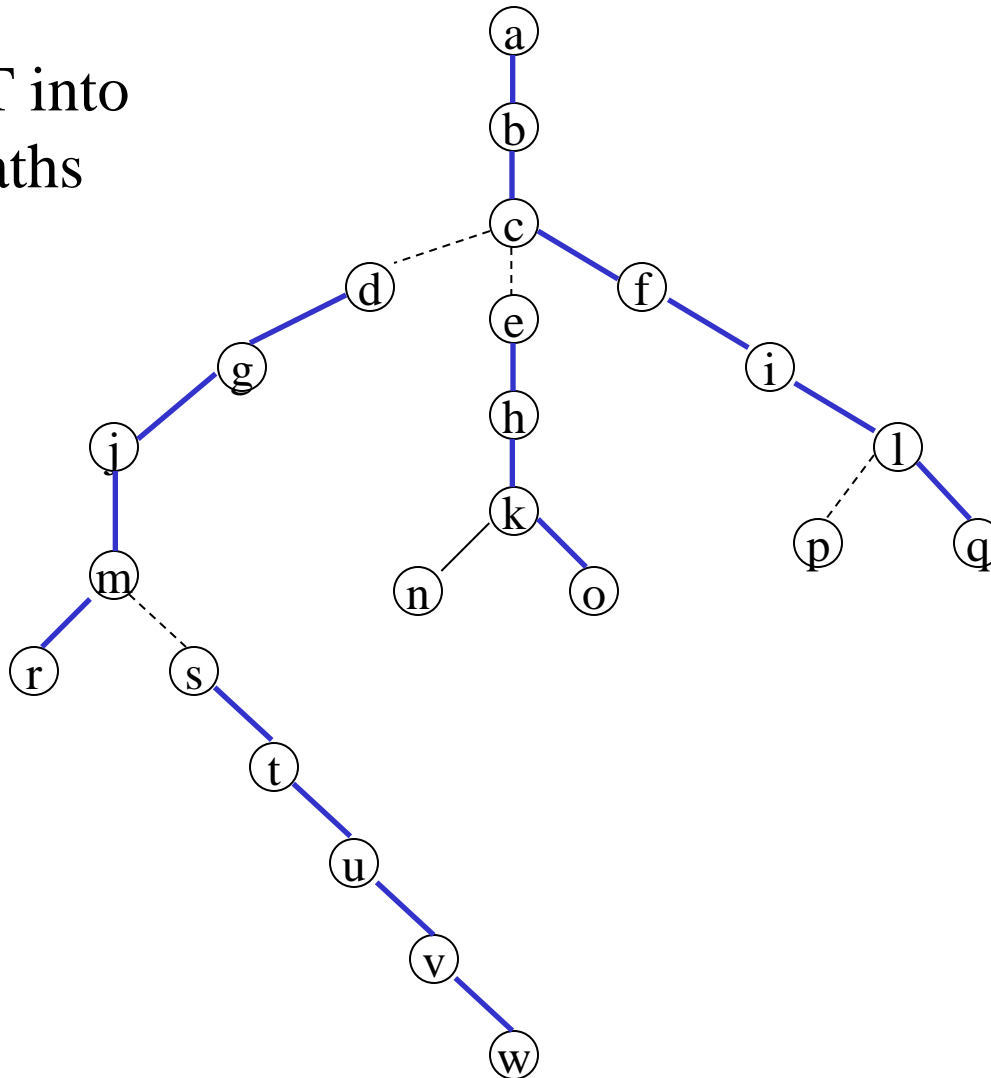
What is the relation between  $V$  and  $T$  ?

# Actual tree



# Path decomposition

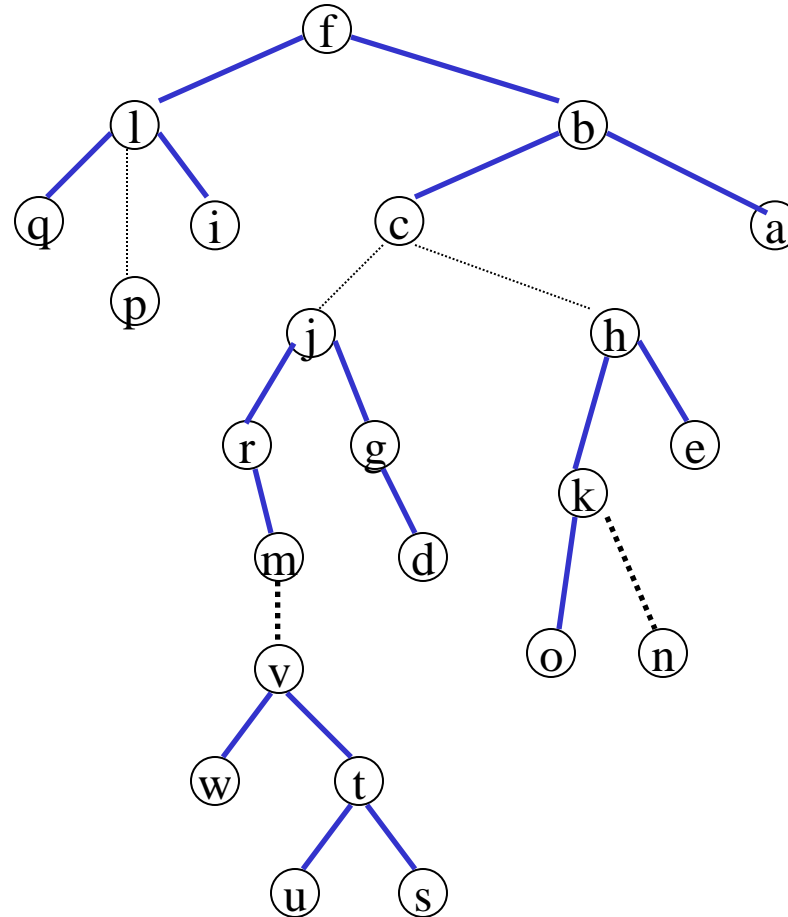
Partition T into  
disjoint paths



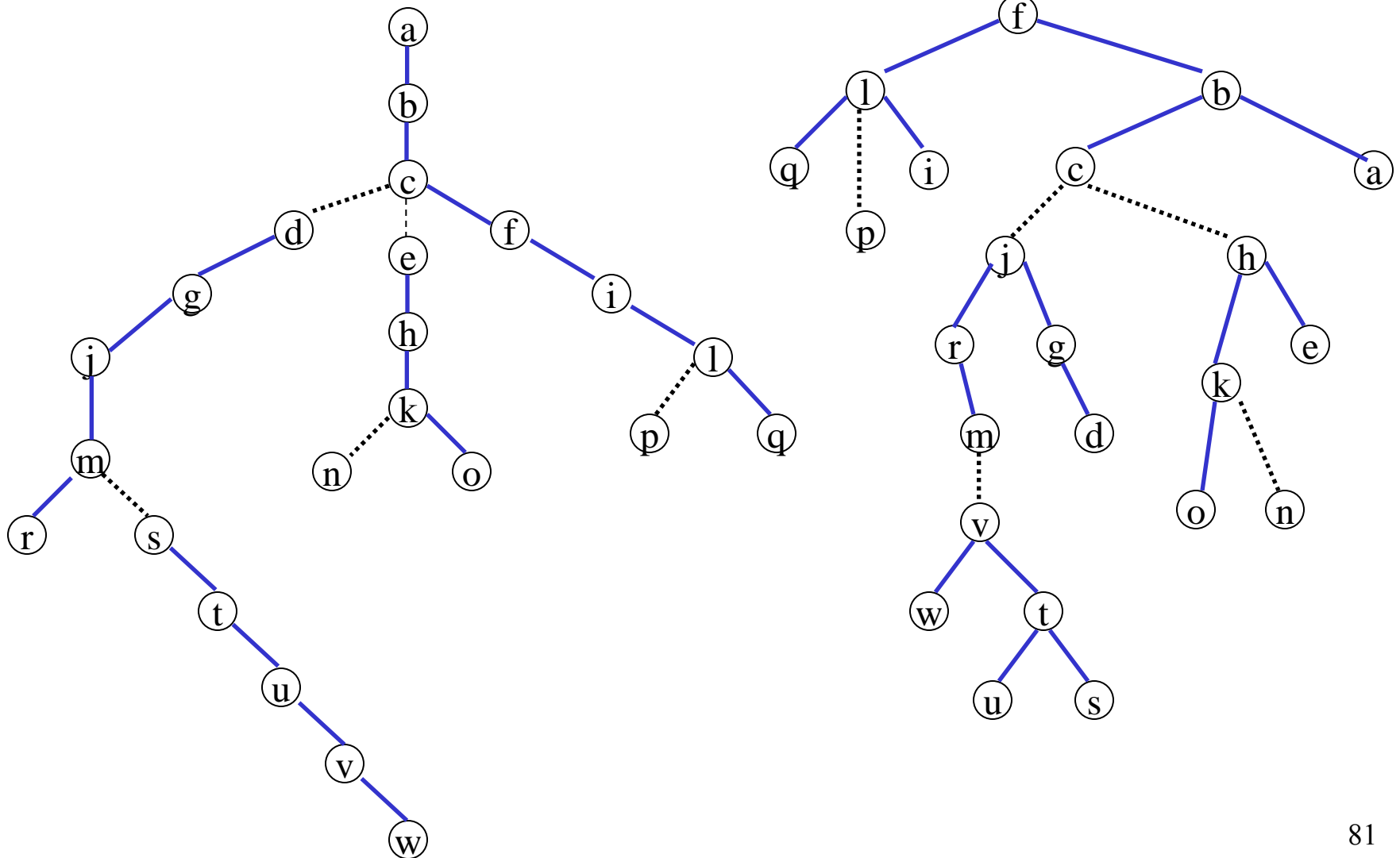
# Virtual trees (cont)

Each path in  $T$   
corresponds to a solid  
subtree in  $V$

The parent of a vertex  
 $x$  in  $T$  is the successor  
of  $x$  (in symmetric  
order) in its solid  
subtree or the parent  
of the solid subtree if  
 $x$  is the last in  
symmetric order in  
this subtree



# Virtual trees (cont)



# Virtual trees (representation)

Each vertex points to  $p(x)$  to its left son  $l(x)$  and to its right son  $r(x)$ .

A vertex can easily decide if it is a left child a right child or a middle child.

Each solid subtree functions like a splay tree.

# The general case

Each solid subtree of a virtual tree is a splay tree.

We represent costs essentially as before.

$\Delta\text{cost}(x) = \text{cost}(x) - \text{cost}(p(x))$  or  $\text{cost}(x)$  is  $x$  is a root of a solid subtree

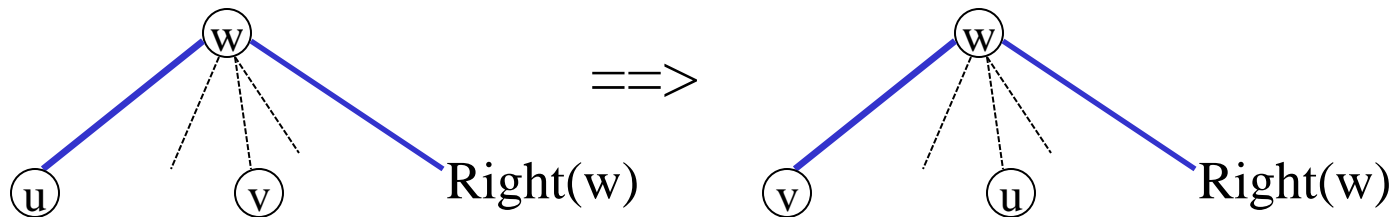
$\Delta\text{min}(x) = \text{cost}(x) - \text{mincost}(x)$  (where  $\text{mincost}$  is the minimum cost within the subtree)



# Splicing

Want to change the path decomposition such that  $v$  and the root are on the same path.

Let  $w$  be the root of a solid subtree and  $v$  a middle child of  $w$



Want to make  $v$  the left child of  $w$ . It requires:

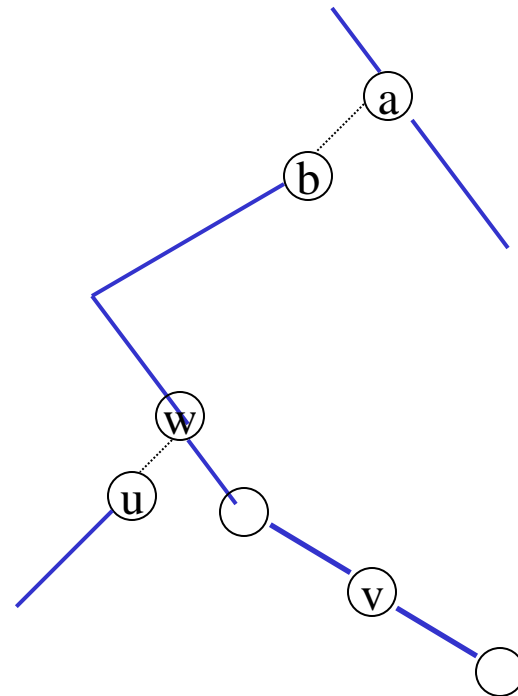
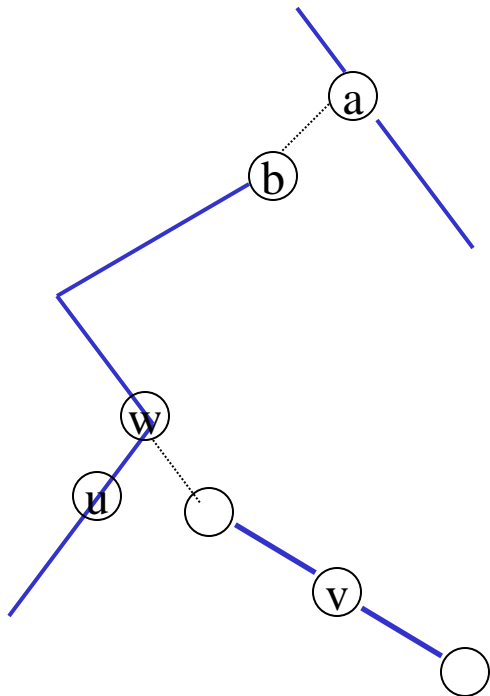
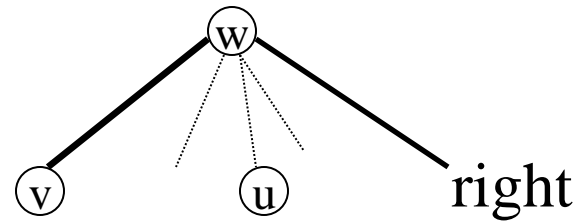
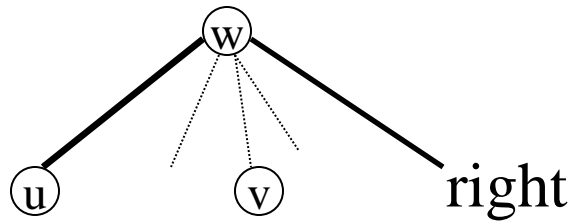
$$\Delta \text{cost}'(v) = \Delta \text{cost}(v) - \Delta \text{cost}(w)$$

$$\Delta \text{cost}'(u) = \Delta \text{cost}(u) + \Delta \text{cost}(w)$$

$$\Delta \text{min}'(w) = \max \{0, \Delta \text{min}(v) - \Delta \text{cost}'(v), \Delta \text{min}(\text{right}(w)) - \Delta \text{cost}(\text{right}(w))\}$$

# Splicing (cont)

What is the effect on the path decomposition of the real tree ?



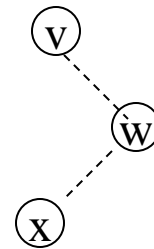
# Splaying the virtual tree

Let  $x$  be the vertex in which we splay.

We do 3 passes:

1) Walk from  $x$  to the root and splay within each solid subtree

After the first pass the path from  $x$  to the root consists entirely of dashed edges



2) Walk from  $x$  to the root and splice at each proper ancestor of  $x$ .

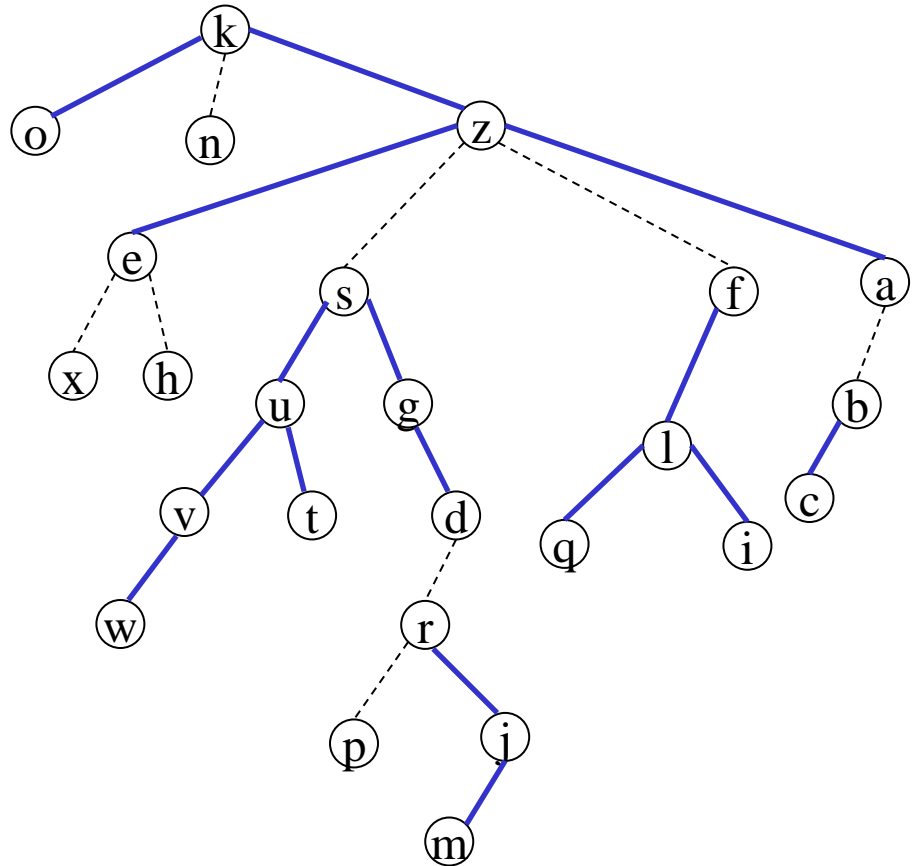
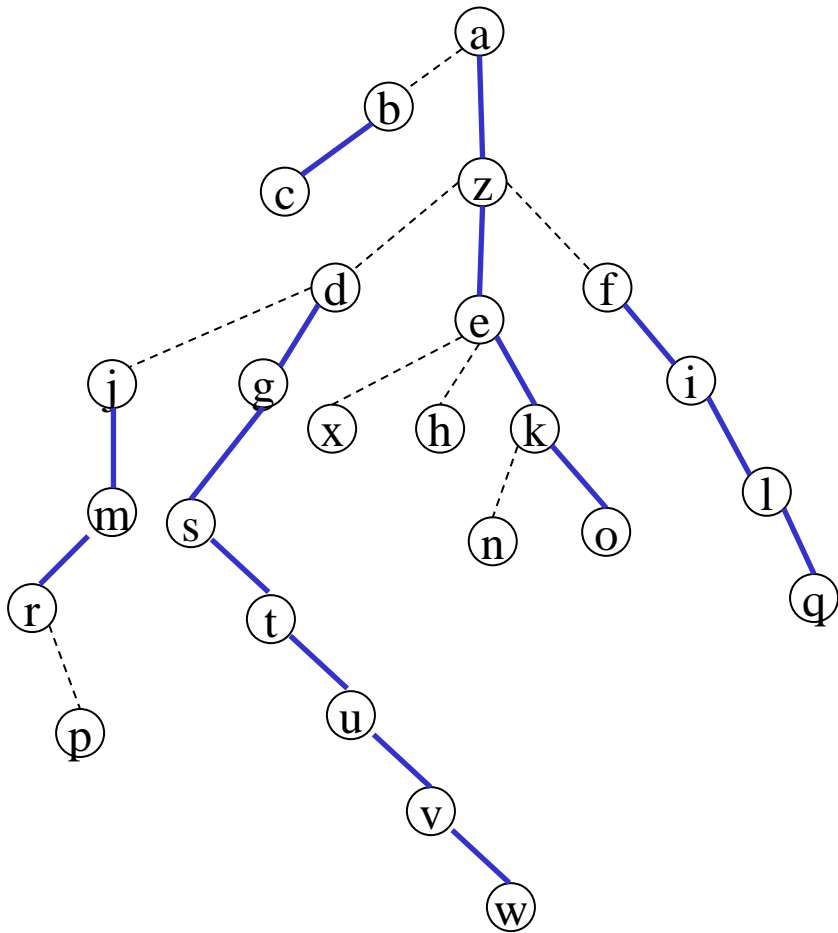
Now  $x$  and the root are in the same solid subtree

3) Splay at  $x$

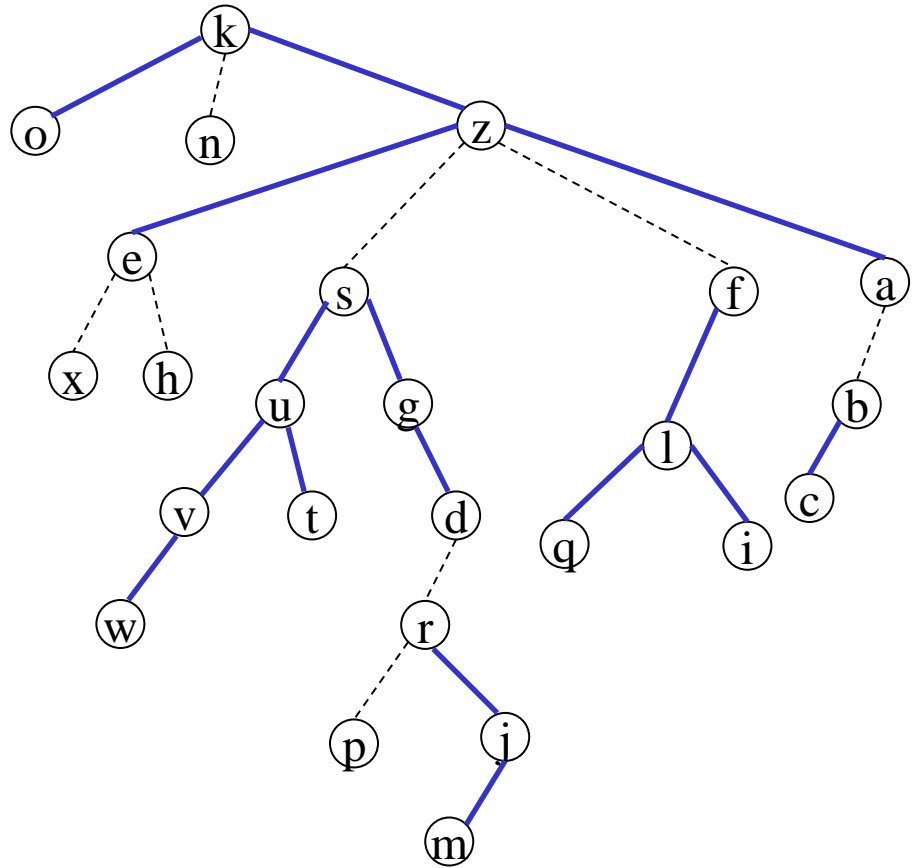
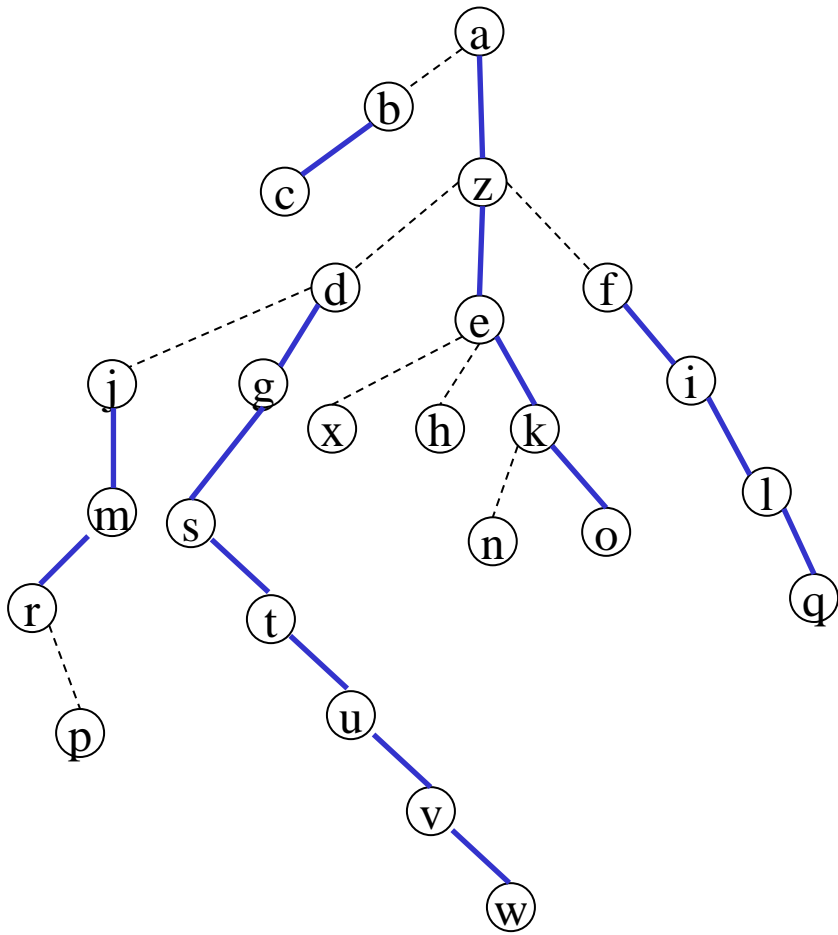
Now  $x$  is the root of the entire virtual tree.

# Example

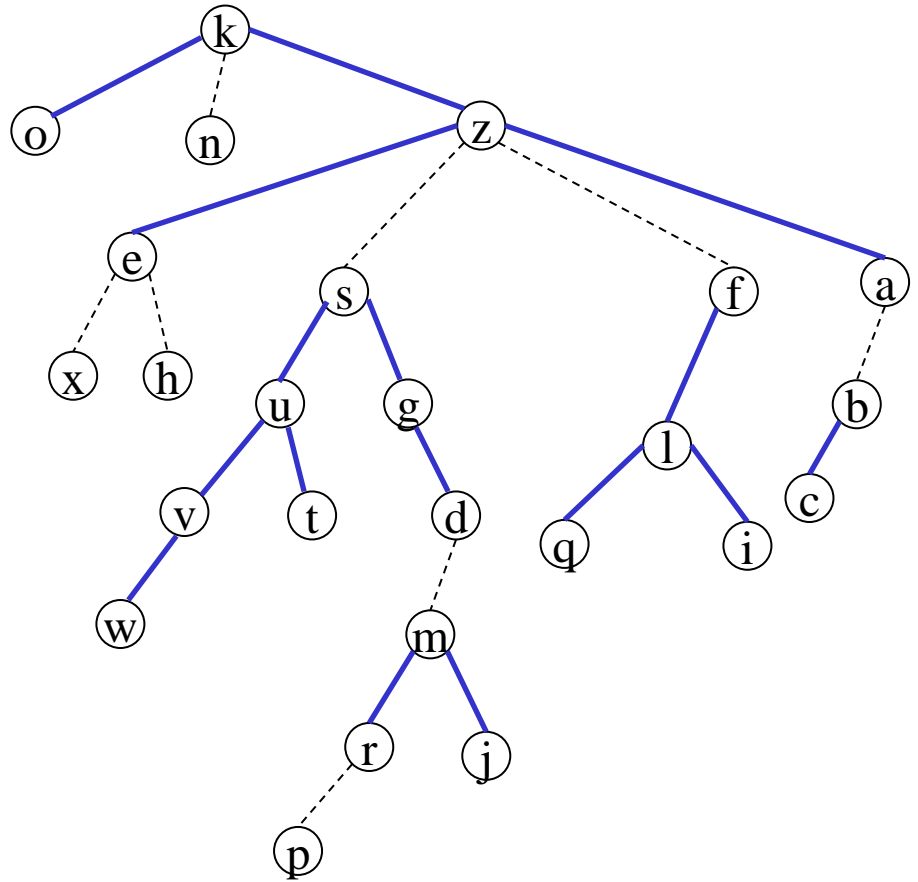
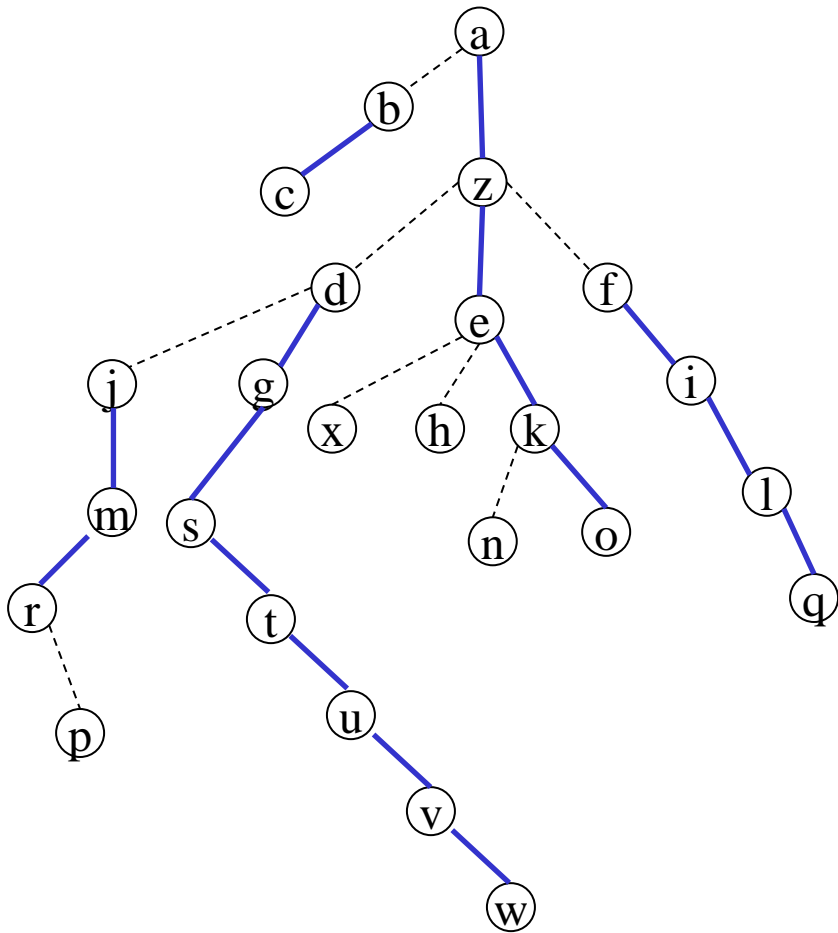
# Actual and virtual trees



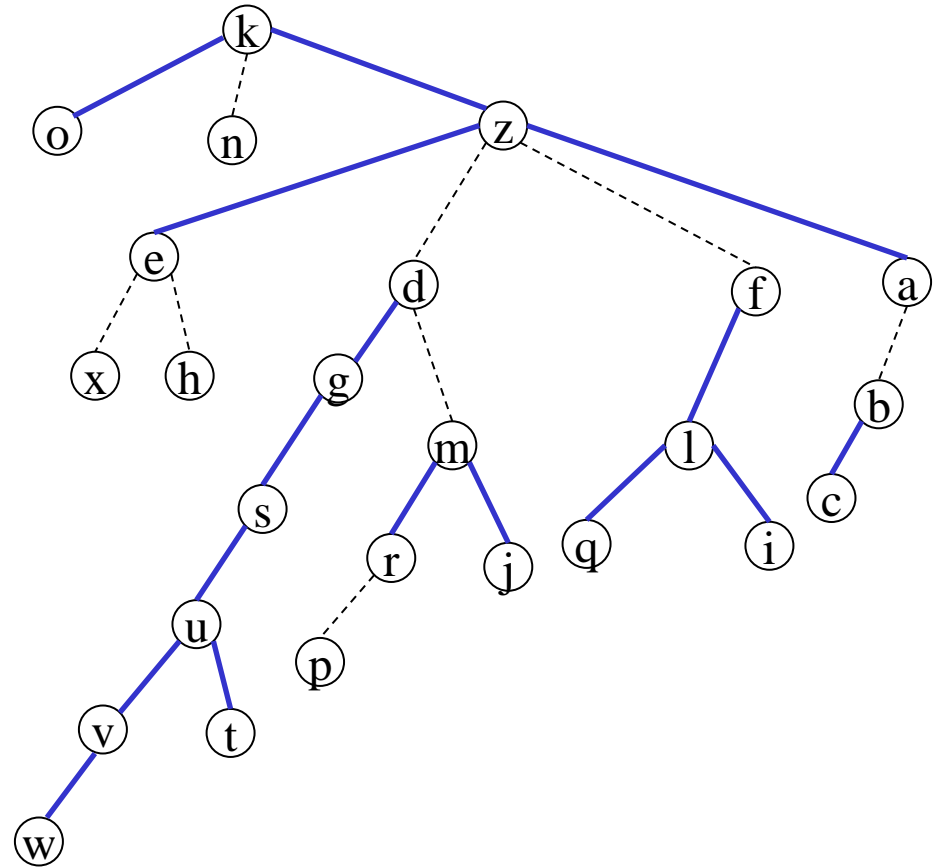
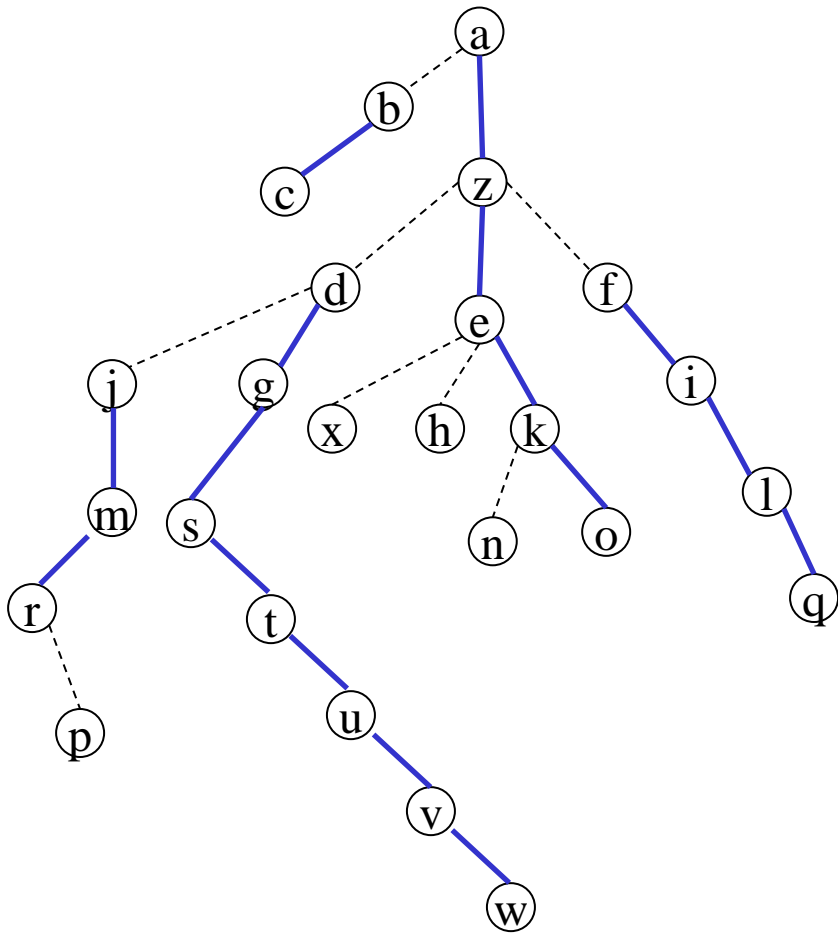
# Splay at m



# Splay at m

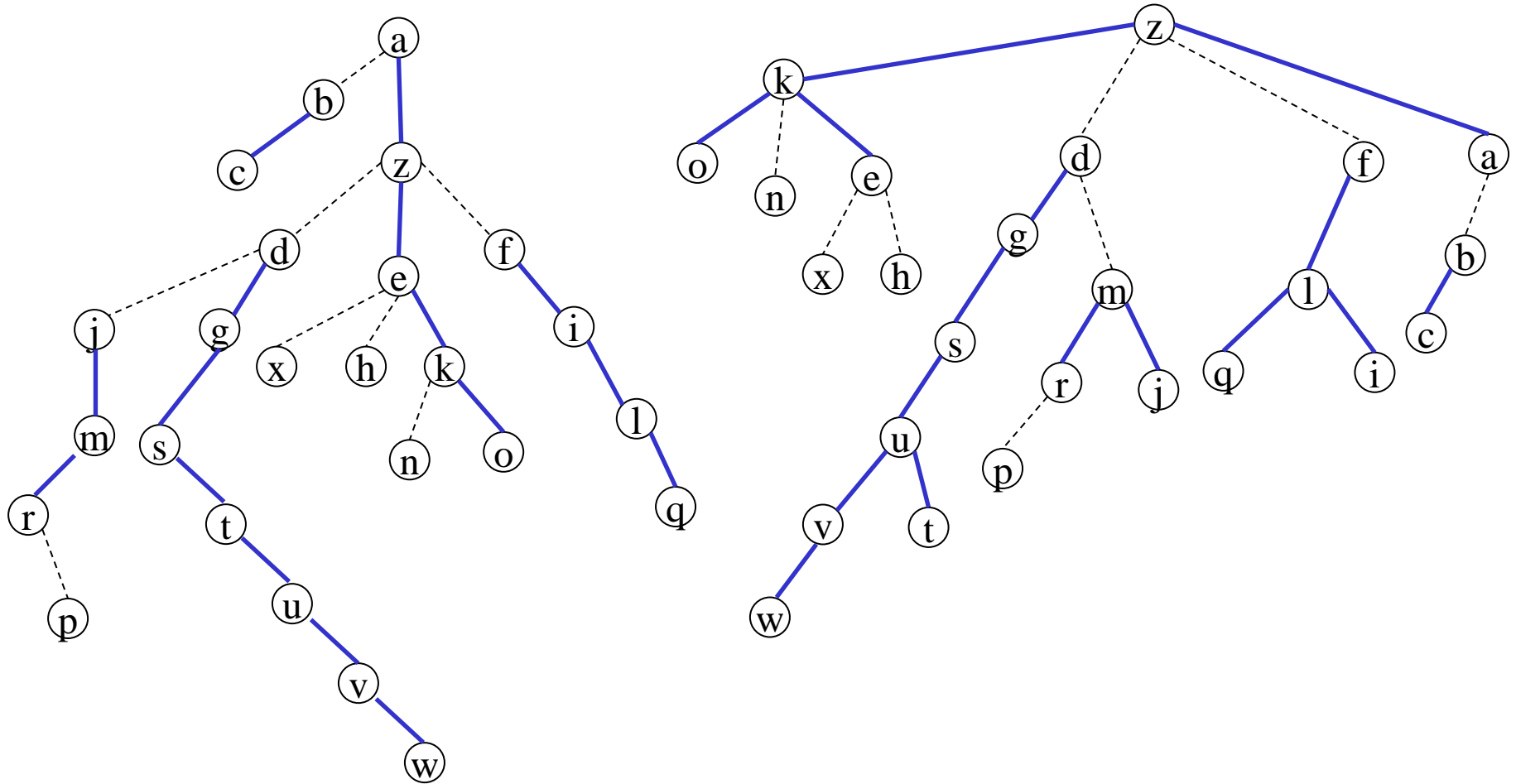


# Splay at m

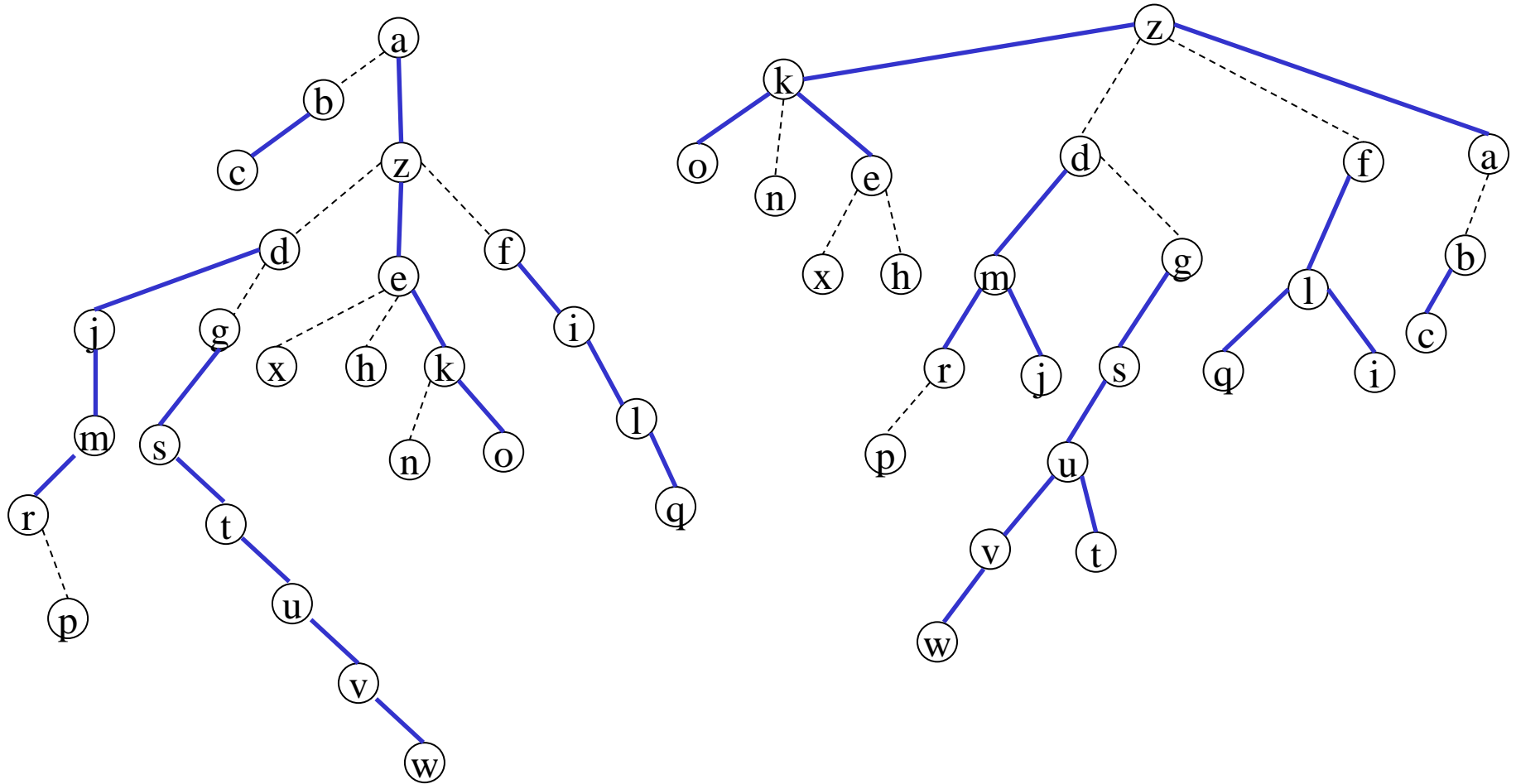




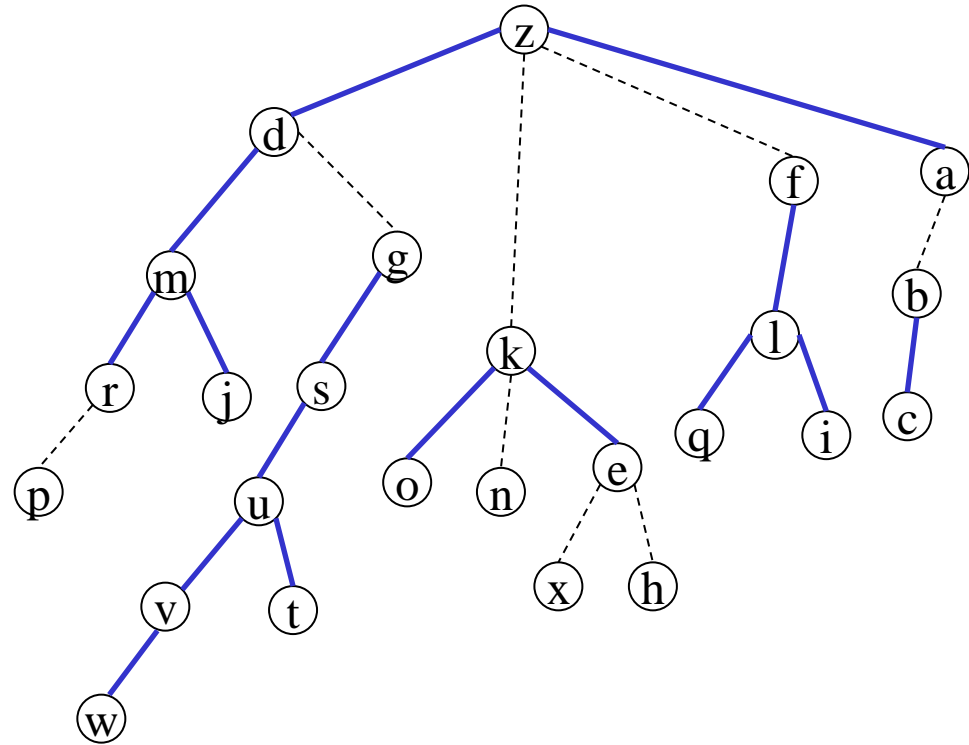
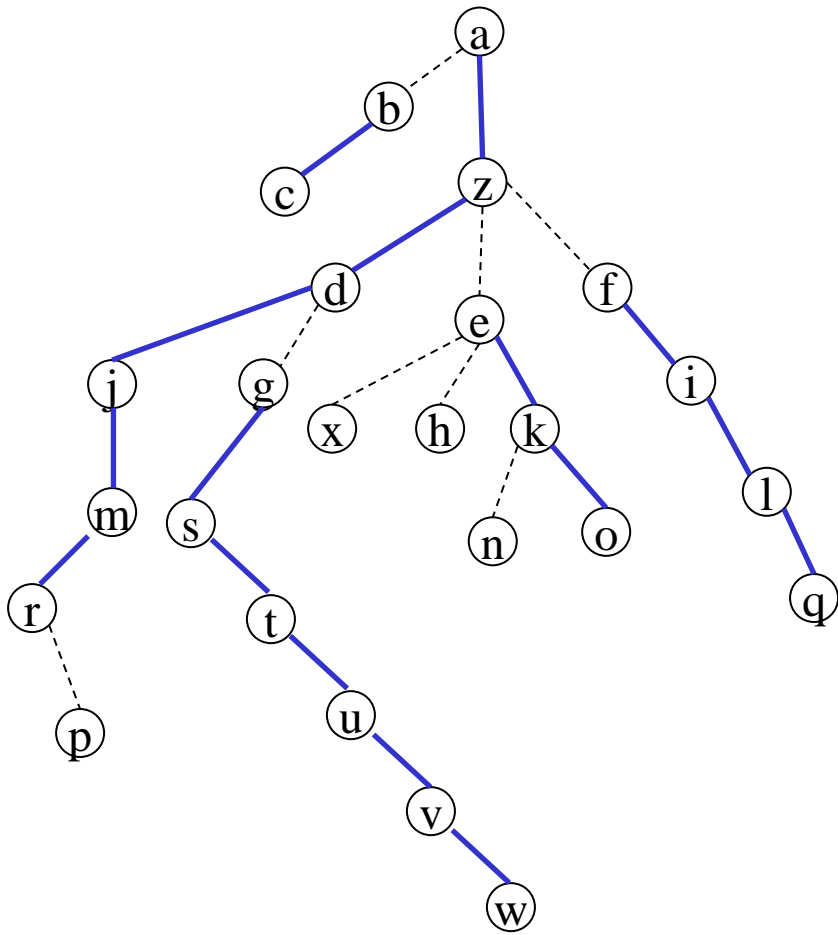
# Splay at m



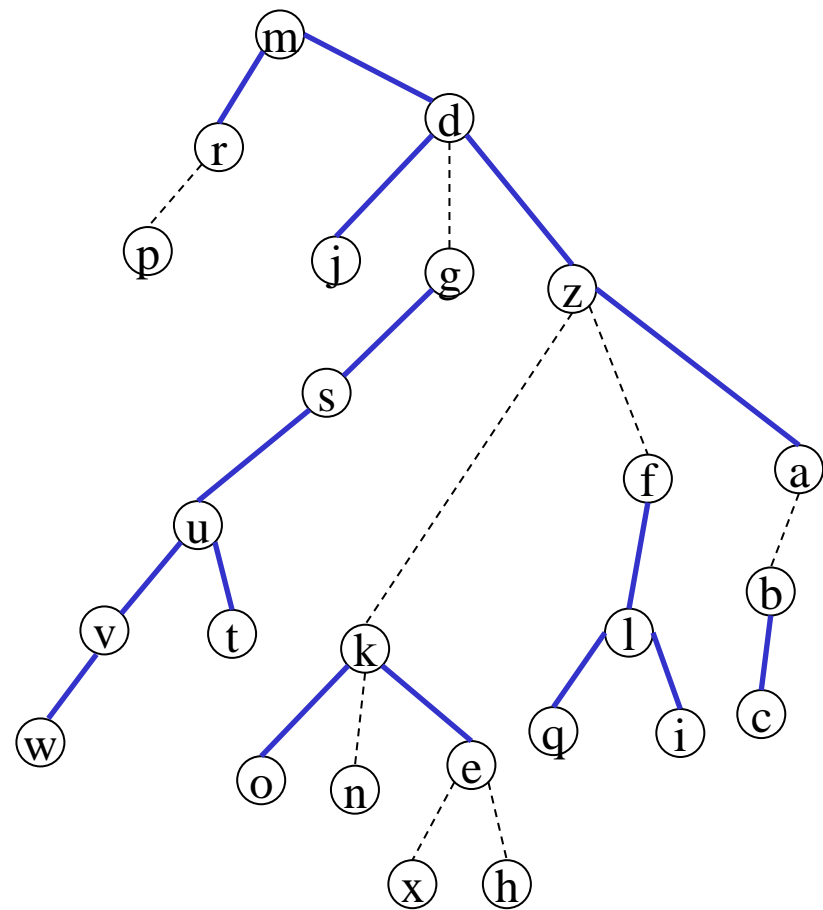
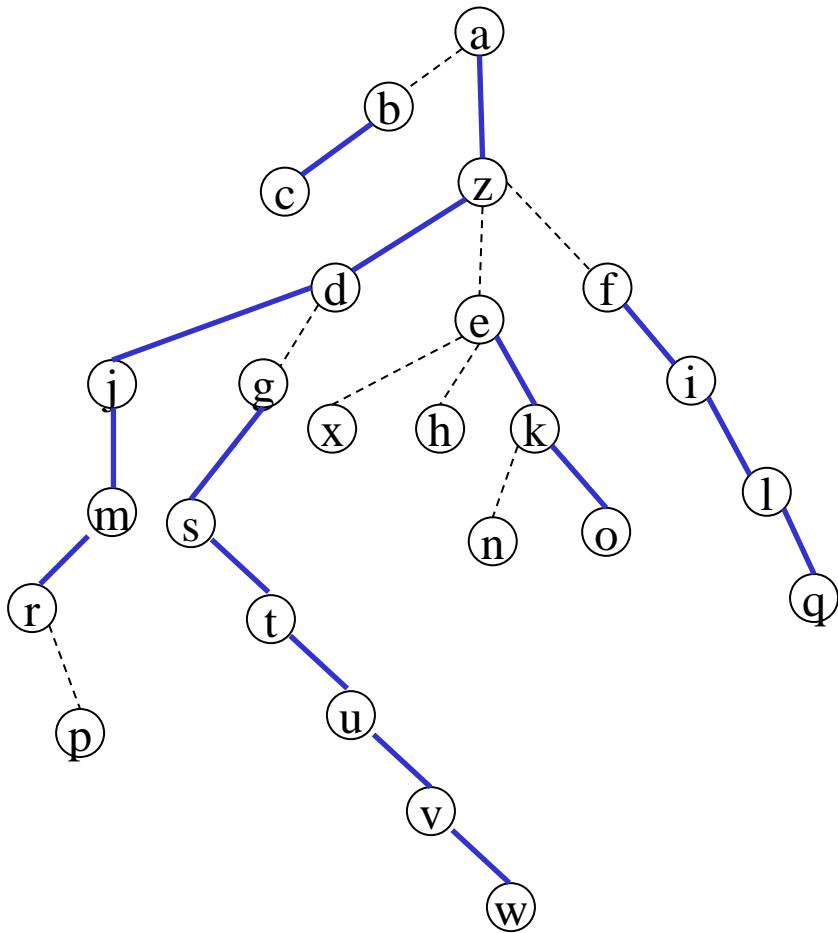
# Splay at m



# Splay at m



# Splay at m



# Dynamic tree operations

$w = \text{findroot}(v)$  : Splay at  $v$ , follow right pointers until reaching the last node  $w$ , splay at  $w$ , and return  $w$ .

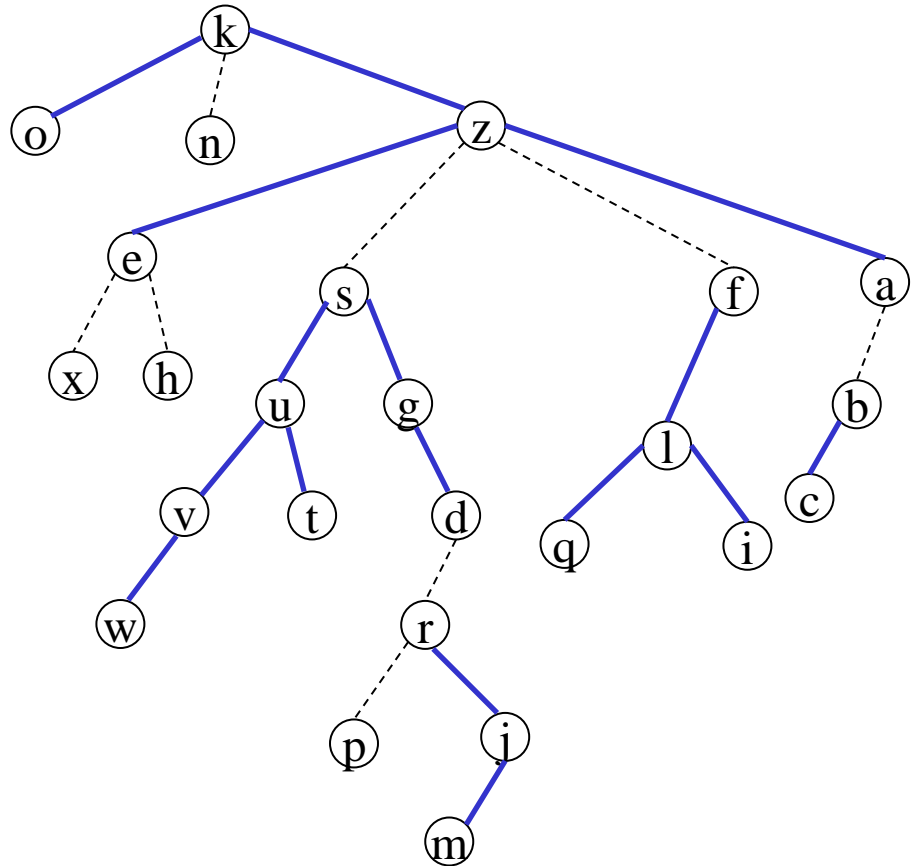
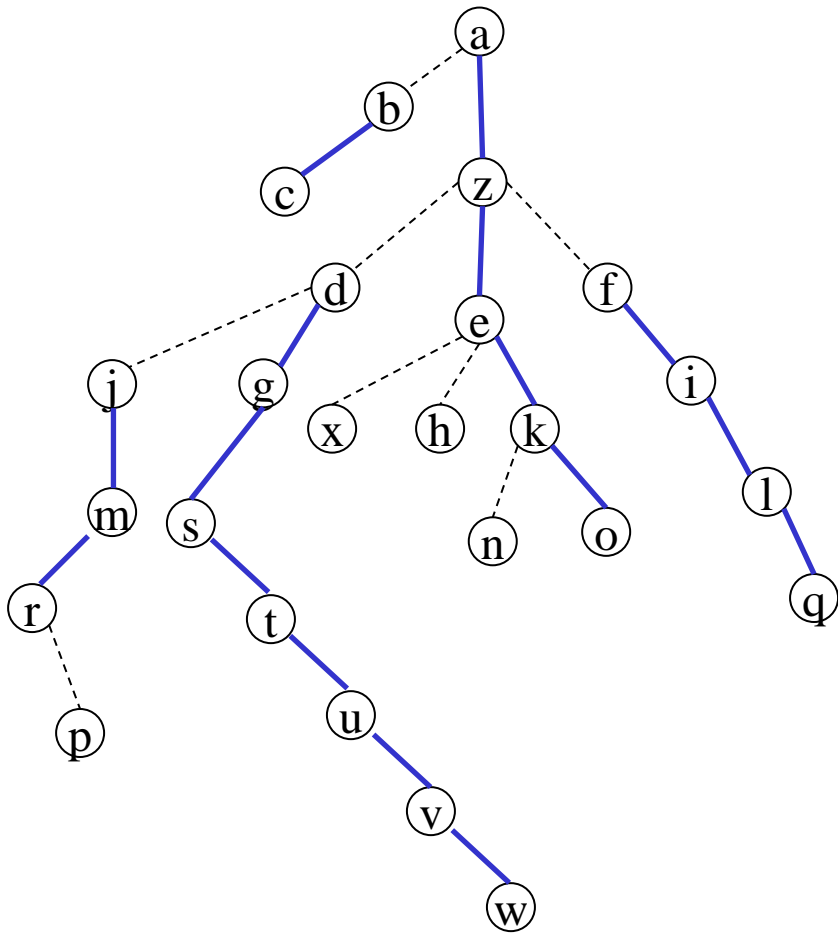
$(v,c) = \text{mincost}(v)$  : Splay at  $v$  and use  $\Delta\text{cost}$  and  $\Delta\text{min}$  to follow pointers to the smallest node after  $v$  on its path (its in the right subtree of  $v$ ). Let  $w$  be this node, splay at  $w$ .

$\text{addcost}(v,c)$  : Splay at  $v$ , increase  $\Delta\text{cost}(v)$  by  $c$  and decrease  $\Delta\text{cost}(\text{left}(v))$  by  $c$ , update  $\Delta\text{min}(v)$

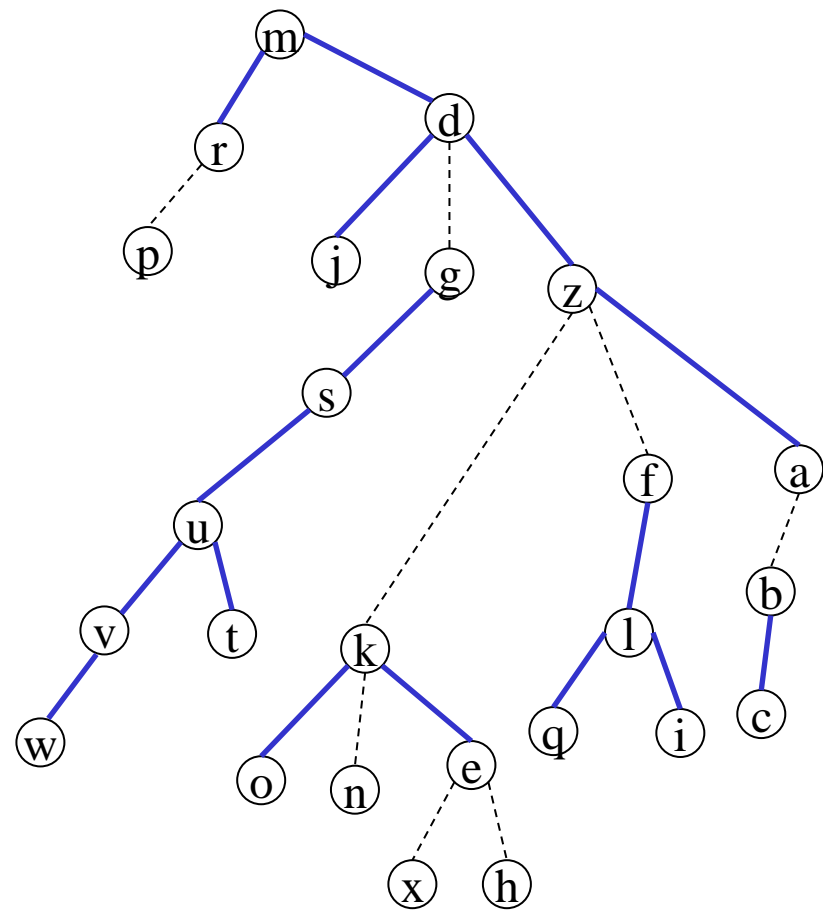
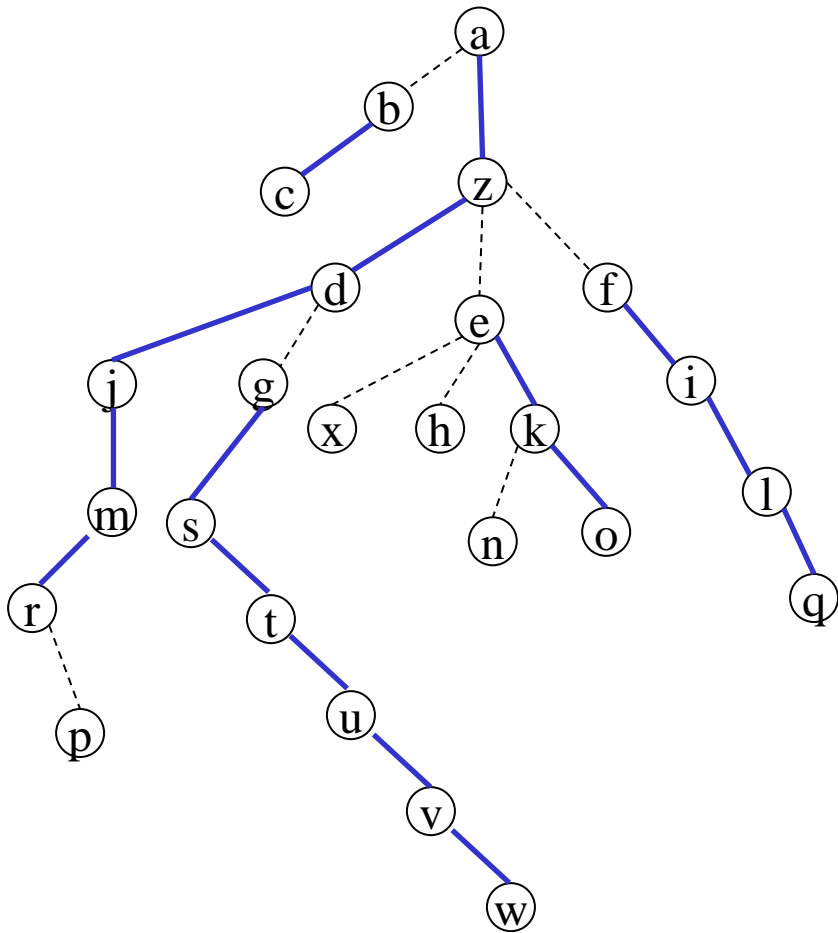
$\text{link}(v,w,c(v,w))$  : Splay at  $v$ , update the cost of  $v$  to be  $c(v,w)$  (requires updates to  $\Delta\text{cost}(v)$ ,  $\Delta\text{min}(v)$ ,  $\Delta\text{cost}(\text{left}(v))$ , and  $\Delta\text{cost}(\text{right}(v))$ ), splay at  $w$  (so potential does not increase too much when we add  $v$  as a child) and make  $v$  a middle child of  $w$

$\text{cut}(v)$  : Splay at  $v$ , break the link between  $v$  and  $\text{right}(v)$ , set  $\Delta\text{cost}(\text{right}(v)) += \Delta\text{cost}(v)$

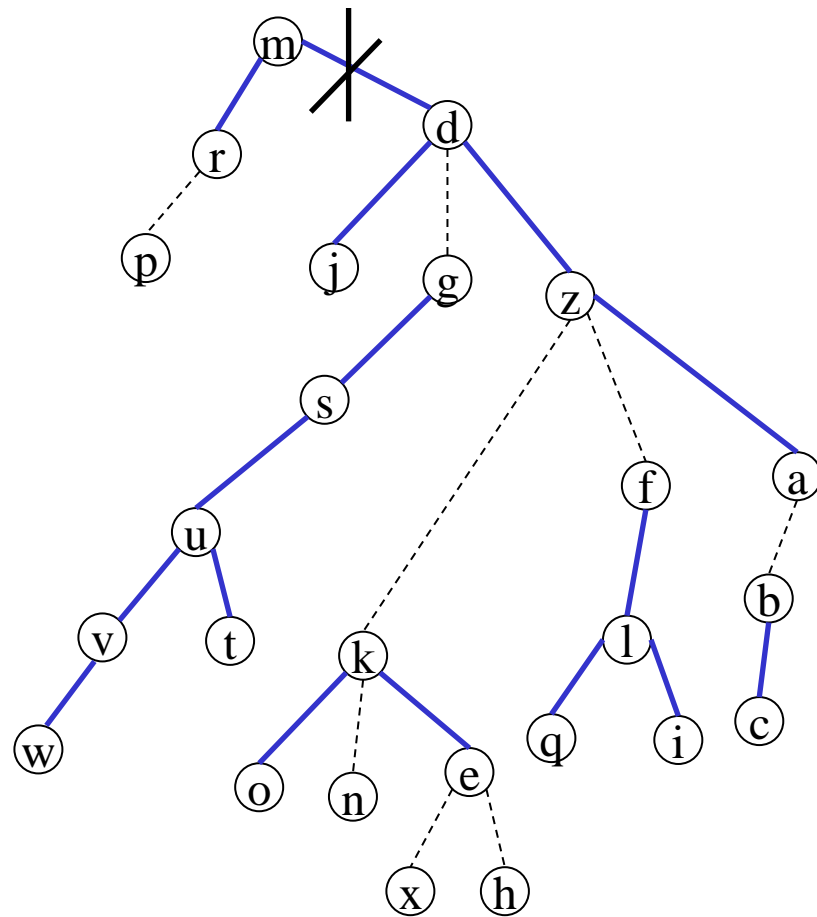
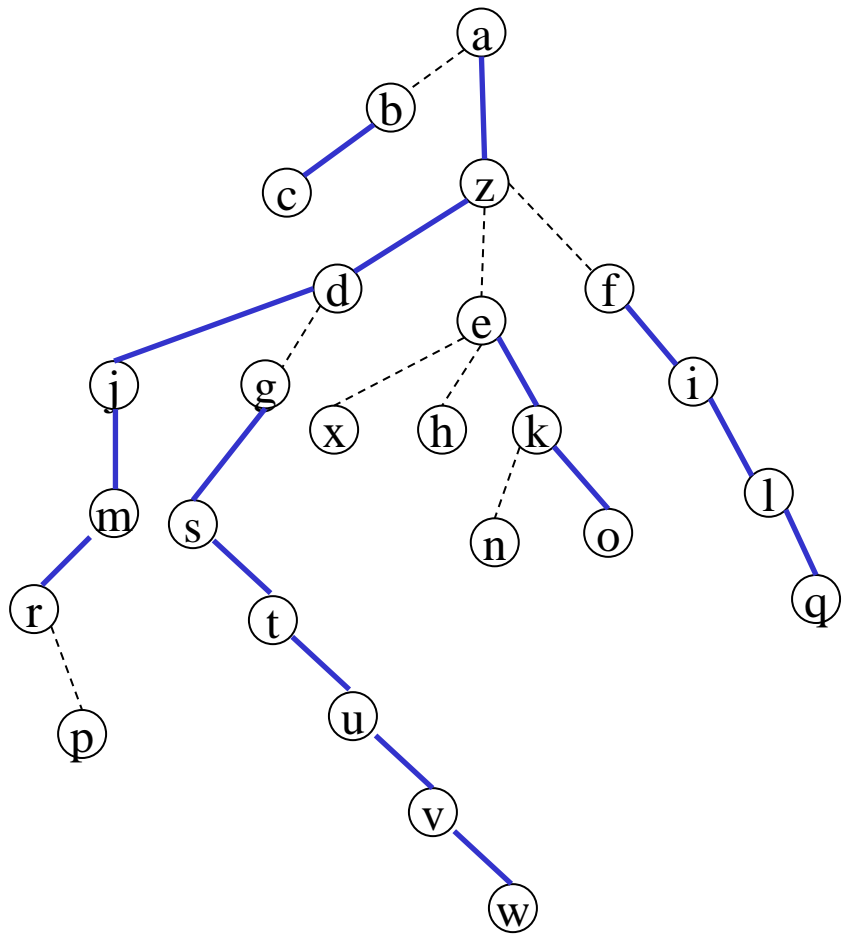
# Cut(m)



# Splay at m



# Cut at m





# Dynamic tree (analysis)

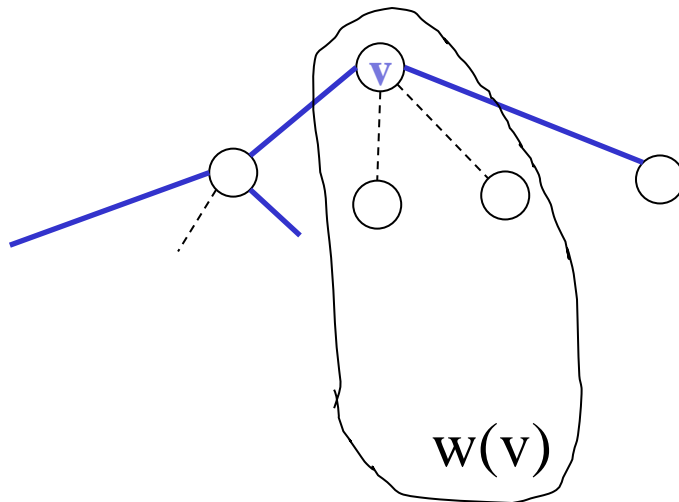
It suffices to analyze the amortized time of splay in the virtual tree

Use the access lemma as follows:

The **weight assigned** to each node/item  $v$  is

$1 + \sum$  sizes of subtrees (in the virtual tree) rooted at **middle** children of  $v$

➔ The size of  $v$  is the #elements in  $v$ 's subtree in the virtual tree

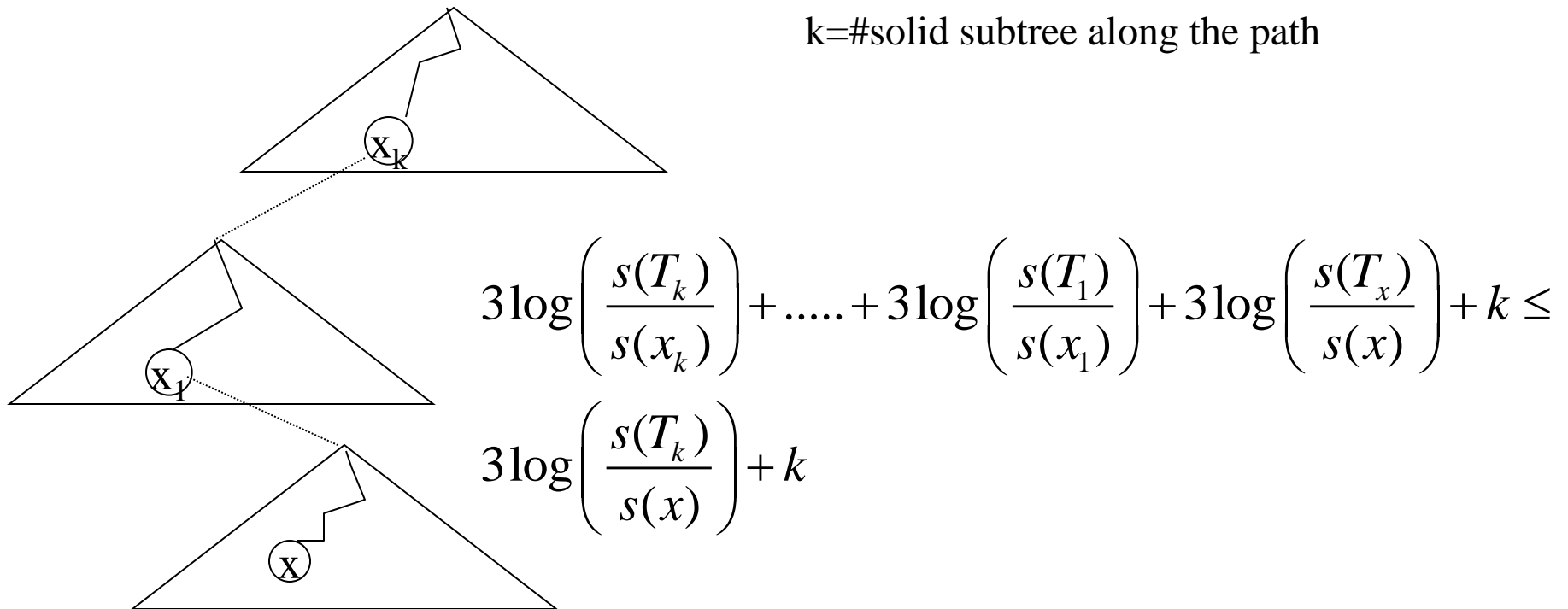


Note: Splices do not affect the **size of  $v$**

# Dynamic tree (analysis)

Analysis of the step (1) of a splay of a node in the virtual tree:

Apply the access lemma to each splay and sum up



# Dynamic tree (analysis)

pass 1 takes  $3\log n + k$

pass 2 takes  $k$

pass 3 takes  $3\log n + 1$

How do we get rid of this  $k$  ?

# Refining the access lemma

**Original version:** The amortized time to splay a node  $x$  in a tree with root  $t$  is at most  $3(r(t) - r(x)) + 1 = 3\log(s(t)/s(x)) + 1$

**Modified version:** For any constant  $c \geq 1$ , the amortized time to splay a node  $x$  in a tree with root  $t$  is at most  $3c(r(t) - r(x)) + 1 = 3c\log(s(t)/s(x)) + 1 - (\ell - 1)(c - 1)$ , where  $\ell$  is the length of the splay path

# Dynamic tree (analysis)

pass 1 takes  $3c \log n + k$

pass 2 takes  $k-1$

pass 3 takes  $3c \log n + 1 - (k-2)(c-1)$

→  $O(\log n)$

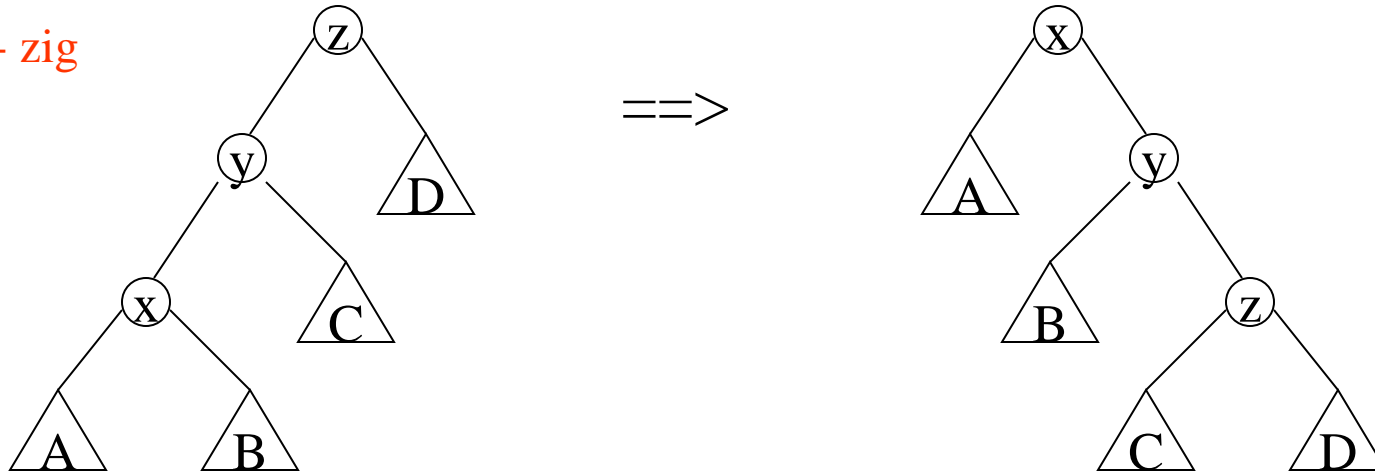
# Proving the modified access lemma

- Same proof, multiply the potential by  $c$ :

Potential is:  $c \cdot \sum \mathbf{r}(\mathbf{x}) = c \cdot \sum \log_2(\mathbf{s}(\mathbf{x}))$

# Proof of the access lemma (cont)

(1) zig - zig



$$\text{amortized time}(\text{zig-zig}) = 2 + \Delta\Phi =$$

$$2 + c(r'(x) + r'(y) + r'(z) - r(x) - r(y) - r(z)) \leq$$

$$2 + c(r'(x) + r'(z) - r(x) - r(y)) \leq 2 + c(r'(x) + r'(z) - r(x) - r(x)) =$$

$$2 + c(r(x) - r'(x) + r'(z) - r'(x) + 3(r'(x) - r(x))) \leq$$

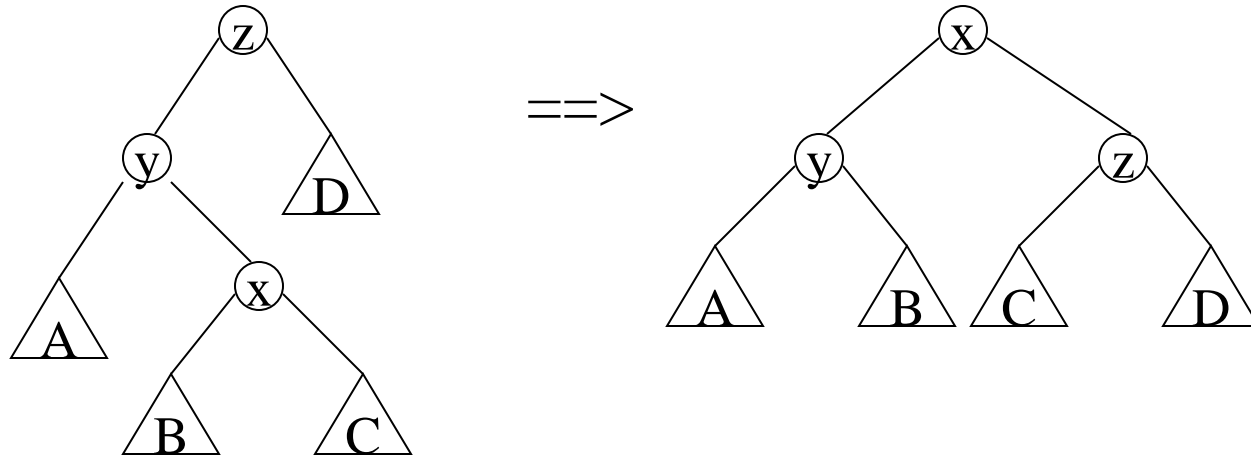
$$2 + c(\log(s(x)/s'(x)) + \log(s'(z)/s'(x))) + 3c(r'(x) - r(x)) \leq$$

$$2 + c(\log([s'(x)/2]/s'(x)) + \log([s'(x)/2]/s'(x))) + 3c(r'(x) - r(x)) =$$

$$3c(r'(x) - r(x)) - 2(c-1)$$

# Proof of the access lemma (cont)

(2) zig - zag



Same modification