

## Summary last week

- **lexicographic** product of partial orders
- **inductively** defined **structures** as **least** set satisfying clauses
- **structural** induction as induction principle w.r.t. **sub**-structure relation
- proof by counterexample **minimal** w.r.t. some well-founded order

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- relation **operations**: identity, converse, intersection, union, composition, product
- **preservation** of property  $P$  by  $n$ -ary operation  $f: P(f(x_1, \dots, x_n))$ , if  $P(x_1), \dots, P(x_n)$
- **being a function** preserved: identity, composition, product
- **being a partial order** preserved: identity, converse, intersection, (lex) product
- **being well-founded** preserved: intersection, (lex) product, comp. extension

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- **being well-founded** preserved: intersection, (lex) product, comp. extension
- **well-founded** /**well-orders** as well-founded partial/total orders
- counting by **cardinals**, sets w.r.t. bijection; **equinumerous**
- counting by **ordinals**, well-orders w.r.t. **isomorphism**; order-preserving bijection

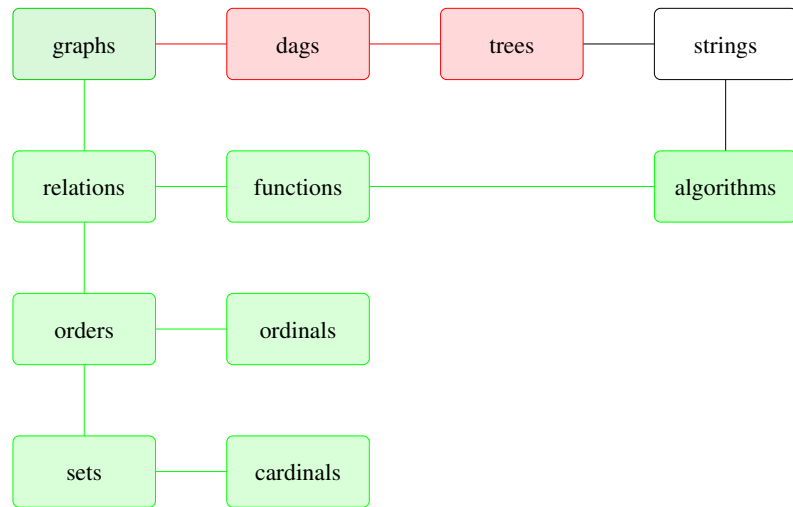
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## Course themes

- **directed** and undirected **graphs**
- **relations** and **functions**
- **orders** and **induction**
- **trees** and **dags**
- finite and infinite counting
- elementary number theory
- Turing machines, algorithms, and complexity
- decidable and undecidable problem

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## Discrete structures



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## Dags and trees motivation

### Example (Dags)

- resource dependencies (build, citation)
- statement dependencies (out-of-order execution)
- sub-expression sharing (call-by-need)
- binary decision diagrams
- ...

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## Dags and trees motivation

### Example (Dags)

- resource dependencies (build, citation)
- statement dependencies (out-of-order execution)
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- ...

### Example (Trees)

- data structures (searching, sorting, XML)
- parse tree (of text)/abstract syntax tree (of program)
- spanning tree (of graph)
- computation tree (of non-deterministic machines)
- ...

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## Dags and trees

### Definition (Cycle)

Let  $(V, E, src, tgt)$  be a directed multigraph

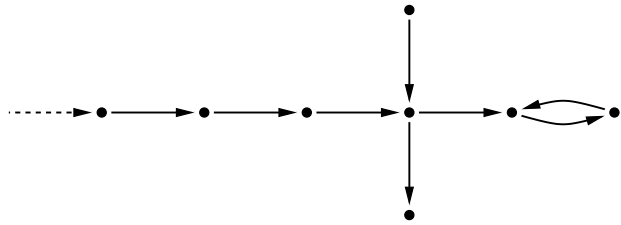
- a path is **closed** if its source is its target
- a non-empty closed path without repeated edges is a **cycle**
- directed multigraphs without cycles are cycle-**free**

### Definition (Dags, forests and (rooted) trees)

- a **dag** is a **directed acyclic graph**
- a **forest** is a dag with nodes of in-degree  $\leq 1$
- in a forest, nodes with out-degree 0 are called **leaves**
- a **tree** is a forest where all  $v_1, v_2$  have a **common ancestor**  $v$  having paths to both
- a **rooted tree** is a tree with a node, the **root**, having a path to all nodes

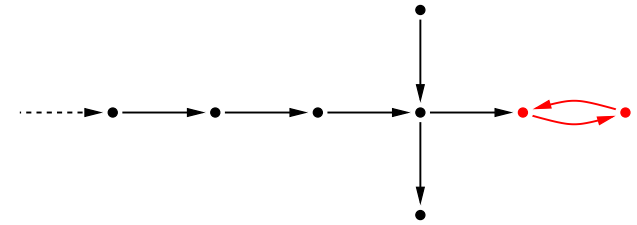
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### Dags and trees example



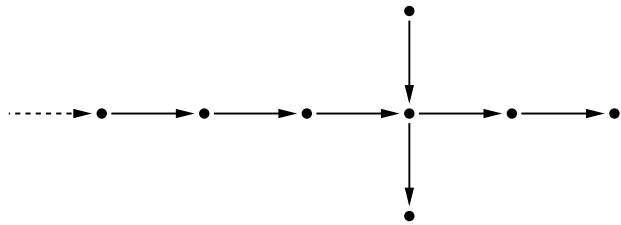
graph

### Dags and trees example



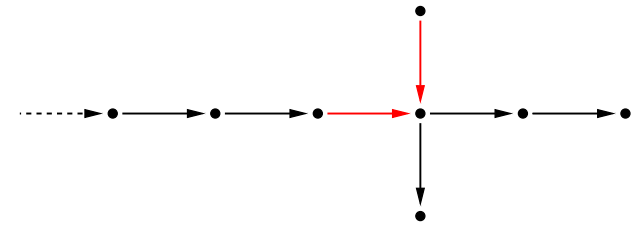
graph but not a dag (cycle)

### Dags and trees example



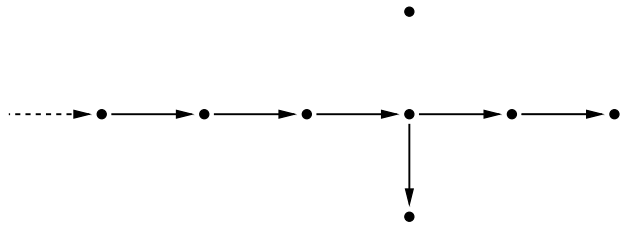
dag

### Dags and trees example



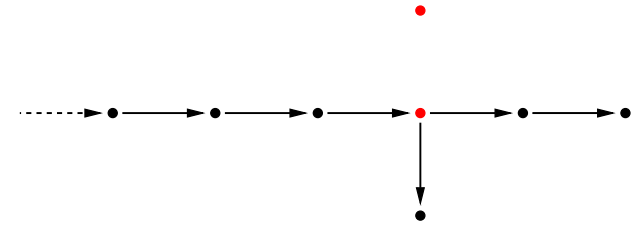
dag but not a forest (indegree 2)

### Dags and trees example



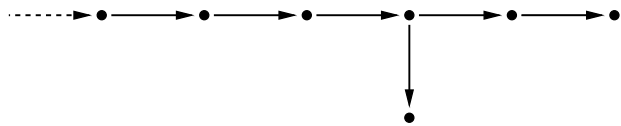
forest

### Dags and trees example



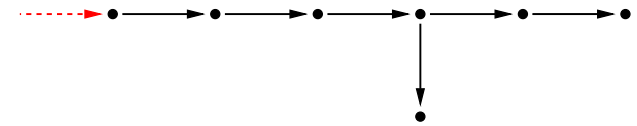
forest but not a tree (no common ancestor)

### Dags and trees example



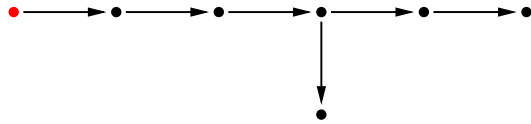
tree

### Dags and trees example



tree but not a rooted tree (no root)

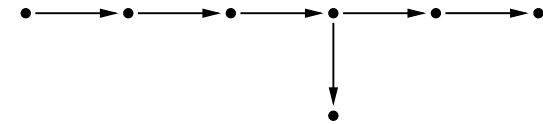
## Dags and trees example



rooted tree (root)

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## Dags and trees example



rooted tree

6

## Simplicity in cycles

### Lemma

*simple paths do not have repeated edges.*

### Proof.

Let  $p$  be a simple path. if some edge  $e$  were to occur twice in it, the source node  $v$  of both occurrences of  $e$  would occur twice as well. ■

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### Corollary

every simple closed path in a multigraph is a cycle

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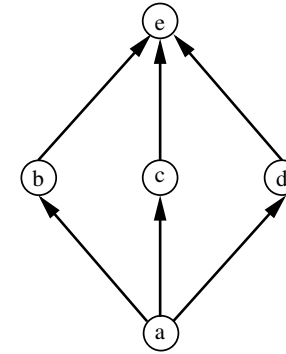
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### Remark

Since paths may be shortened to simple paths, cycles **represent** closed paths.

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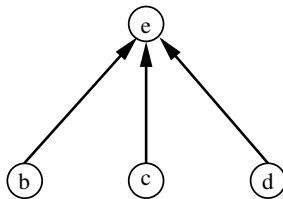
## Topological sorting example



topological sorting: ()

8

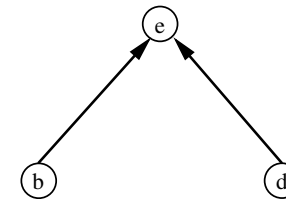
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topological sorting: (a)

8

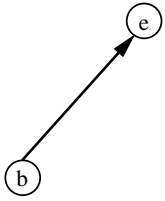
## Topological sorting example



topological sorting: (a, c)

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### Topological sorting example



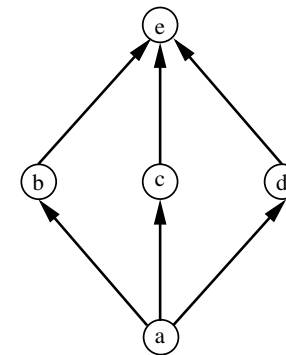
topological sorting:  $(a, c, d)$

### Topological sorting example



topological sorting:  $(a, c, d, b)$

### Topological sorting example



topological sorting:  $(a, c, d, b, e)$

### Topological sorting example

topological sorting:  $(a, c, d, b, e)$   
others:  $(a, c, b, d, e)$ ,  $(a, b, c, d, e)$ ,  $(a, b, d, c, e)$ ,  $(a, d, b, c, e)$ ,  $(a, d, c, b, e)$

## Topological sorting

### Definition

a list  $(a_0, \dots, a_{n-1})$  is **topologically**  $\leq$ -sorted for **partial** order  $\leq$ , if  $a_i < a_j$  implies  $i < j$

### Remark

if  $\leq$  is a **total** order, then topologically  $\leq$ -sorted iff globally  $\leq$ -sorted

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### Proof.

if  $l = (a_0, \dots, a_{n-1})$  is topologically sorted and no element of  $A$  is smaller than any element of  $l$ , then so are  $l' = (a_0, \dots, a_{n-1}, a_n)$  and  $A - \{a_n\}$  for  $a_n$  minimal in  $A$ :  $l'$  is topologically sorted since  $l$  is, and  $a_n \not< a_j$  since no element of  $A$  is smaller than any element of  $l$ , and if  $a_i < a_n$  then  $i < n$  because  $0 \leq i < n$  is an index in  $l$ . ■

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if  $G$  is a dag, then  $\leq_G$  defined by  $v \leq_G v'$  if there is a path from  $v$  to  $v'$ , is a partial order.

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### Proof.

**reflexivity** and **transitivity** hold by empty paths and composing paths. To see **anti-symmetry** consider paths from  $v$  to  $v'$  and from  $v'$  to  $v$ . Both must be empty as otherwise their composition would yield a **cycle** in  $G$ , hence  $v = v'$ . ■

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### Corollary

every finite dag  $G$  can be topologically  $\leq_G$ -sorted.

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## Shortest paths in dags

### Lemma

in a finite dag, **shortest** and **longest** paths can be computed in  $O(n)$

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### Proof.

**shortest** path adapting topological sorting: let  $G$  be weighted graph with nodes  $v, v'$ .

- 1 initialise  $v$  with distance 0
- 2 while  $G$  is non-empty
  - a) set  $w$  to a **minimal** node having some distance (no edges from other such to  $w$ ), say  $d$
  - b) if  $w = v'$  return  $d$
  - c) for each edge  $e : w \rightarrow_k w'$  set the distance  $d'$  of  $w'$  to  $\min(d', d + k)$ .
  - d) remove  $w$  and all edges from it, from  $G$
- 3 return  $\infty$

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## Facts on trees

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let  $G$  be a finite tree having, say,  $n$  nodes  $\{v_1, \dots, v_n\}$ . Setting  $v'_1 = v_1$  and  $v'_{i+1}$  to be a common ancestor of  $v'_i$  and  $v_{i+1}$ , we obtain that  $v'_n$  is a common ancestor of all nodes. Therefore,  $v'_n$  is the root. ■ ■

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### Lemma (Characterising forests and rooted trees)

1 in a forest there is **at most one** path from a node  $v$  to a node  $v'$

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- 1 For a proof by contradiction, suppose there were **two** paths from  $v$  to  $v'$ . If  $v = v'$ , then one of them would be a cycle, contradicting acyclicity. If  $v \neq v'$  let  $e \neq f$  be the **last** edges where the paths differ, starting comparing from  $v'$ . By being the last such,  $e$  and  $f$  must have the same target, contradicting in-degree  $\leq 1$ .

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- 2 (only-if) By the definition of rooted tree and the previous item.  
(if) Uniqueness of paths entails the multigraph can have neither **parallel** edges nor **cycles**, so is a dag. If there were edges  $e \neq f$  with the same target  $v'$ , then there would be distinct paths from  $v$  to  $v'$  via the respective sources of  $e$  and  $f$ , which cannot be, so **in-degree  $\leq 1$**  and we have a forest. Taking  $v$  as **root** shows the forest is a rooted tree. ■

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## The number of edges and vertices in a tree

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We obtain  $R$  is bijection, hence  $V - \{v\}$  and  $E$  are **equinumerous**. ■

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### Definition (undirected multigraph)

An **undirected** multigraph is given by

- a set of **nodes** or **vertices**  $V$
- a set of **edges**  $E$
- a map  $r: E \rightarrow \{\{c, d\} \mid c, d \in V\}$  with  $e \mapsto r(e)$ , that maps every edge  $e$  to a set  $r(e)$  having one or two elements, its **endpoints**.
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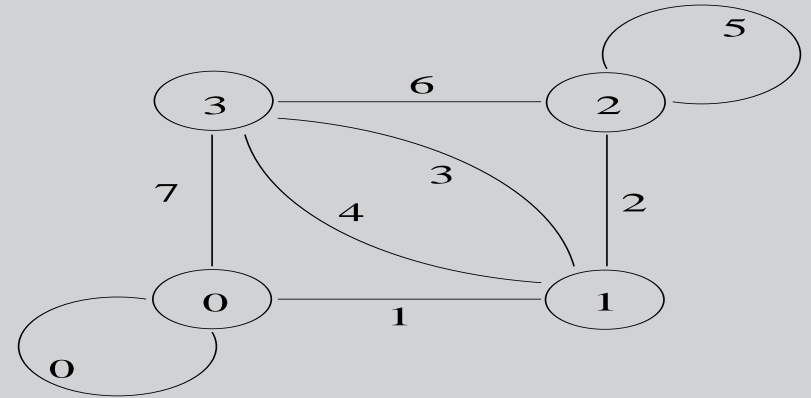
### Example

Let  $V = \{0, 1, 2, 3\}$ ,  $E = \{0, 1, 2, \dots, 7\}$  and the function  $r$  be defined by

$e$	$r(e)$	$e$	$r(e)$
0	$\{0\}$	4	$\{1, 3\}$
1	$\{0, 1\}$	5	$\{2\}$
2	$\{1, 2\}$	6	$\{2, 3\}$
3	$\{1, 3\}$	7	$\{0, 3\}$

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### Example (Continued)



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From directed to undirected multigraphs, and back

### Definition

To a directed multigraph an undirected multigraph can be associated by **forgetting** the directions of edges, defining the set of end-points of an edge  $e$  to comprise its source and target:  $r(e) = \{src(e), tgt(e)\}$ .

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### Remark

**Not** inverse to each other, but often **preserve** properties. For instance, there being a path between two nodes.

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### Definition

- vertex  $c$  is a **neighbour** of the vertex  $d$ , if there exists an edge joining both
- an edge having only one endpoint is a **loop**
- two edges having the same endpoints are **parallel**
- the **degree** of a vertex  $v$  is the number of edges having  $v$  as endpoint
- a multigraph is vertex- resp. edge-**labelled**, if there is a function from  $V$  resp.  $E$  to a set of labels.
- if the labels are numbers, we speak of **weights** and **weighted** multigraphs

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### Definition (undirected graph)

An undirected **graph** is an undirected multigraph without parallel edges: then there is for every set of nodes  $\{c, d\}$  at most one edge joining  $c$  and  $d$ .

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### Definition

- Let  $G = (V, E, r)$  be an undirected multigraph
- $G' = (V', E', r')$  is **sub**-multigraph of  $G$ , if  $V' \subseteq V$ ,  $E' \subseteq E$  and  $r'(e) = r(e)$  for  $e \in E'$
- A **sub**-graph is a sub-multigraph that itself is a graph

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### Definition

Let  $(V, E, r)$  be an undirected multigraph, and let  $c, d$  be vertices

- A tuple  $(e_0, e_1, \dots, e_{\ell-1}) \in E^\ell$  is a **path** from  $c$  to  $d$  of length  $\ell$ , if there are vertices  $v_0, v_1, \dots, v_\ell$  with  $v_0 = c$ ,  $v_\ell = d$ , and  $r(e_i) = \{v_i, v_{i+1}\}$  for  $i = 0, 1, \dots, \ell - 1$
- $v_0$  is the **initial** or **starting** node;  $v_\ell$  is its **end**-node
- $v_1, v_2, \dots, v_{\ell-1}$  are the **intermediate** nodes
- For every node  $v \in V$ , the empty tuple  $() \in E^0$  is the **empty** path with starting node  $v$  and end-node  $v$

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- undirected multigraphs without cycles are called cycle-**free**

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## Undirected forests and trees

### Definition

- A **forest** is a cycle-free undirected multigraph
- A **tree** is a connected forest
- **leaves** are nodes with degree  $\leq 1$  in a forest

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### Example

- In the multigraph in the first example there are the following paths from node 0 to node 3
$$(1, 2, 6), (1, 2, 5, 6), (1, 3), (1, 4), (1, 3, 7, 1, 3), (1, 4, 7, 1, 3), (7)$$

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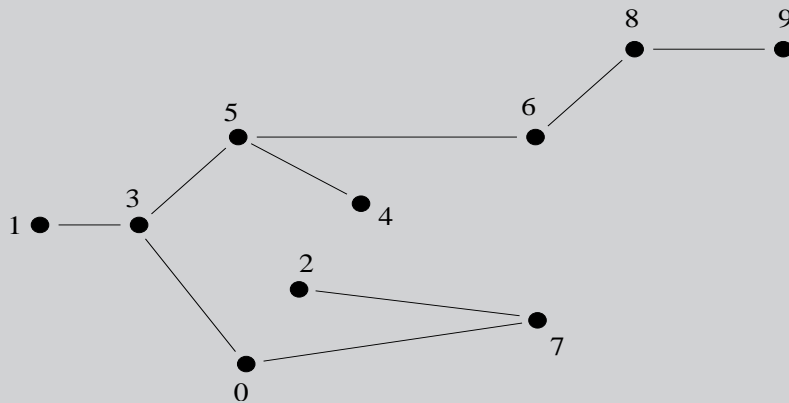
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- The multigraph is connected
- There are simple cycles with starting-node 0

$(0), (1, 2, 6, 7, (1, 3, 7), (1, 4, 7), (7, 3, 1), (7, 4, 1), (7, 6, 2, 1)$

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### Example

The following graph is a connected forest, and therefore a tree; its leaves are 1, 2, 4, 9



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## Characterising undirected trees

### Lemma

For an undirected multigraph  $G$ , the following are equivalent.

- 0)  $G$  is connected but **removing** any edge makes the graph disconnected
- 1) in  $G$  there is a **unique** simple path between any two nodes
- 2)  $G$  is connected and acyclic but **adding** any edge makes the graph contain a cycle

### Proof.

0)  $\Rightarrow$  1) Suppose there were **two** paths between two nodes. W.l.o.g. we may assume these are of minimal (total) length. Then they do not have edges in common, so removing any edge on them the graph would remain **connected**. Contradiction ■

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### Proof.

1)  $\Rightarrow$  2) By assumption, there is a **unique** path  $p$  between  $v$  and  $v'$ . Adding a fresh edge  $e$  between them, makes the concatenation of  $p$  and  $e$  into a **cycle**. ■

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### Proof.

2)  $\Rightarrow$  0) If removing an edge  $e$  between  $v$  and  $v'$  from  $G$  would not affect being **connected**, there would be a path between  $v$  and  $v'$  in which  $e$  does not occur. But then the concatenation of  $e$  and  $p$  would be a **cycle** in  $G$  already. Contradiction. ■

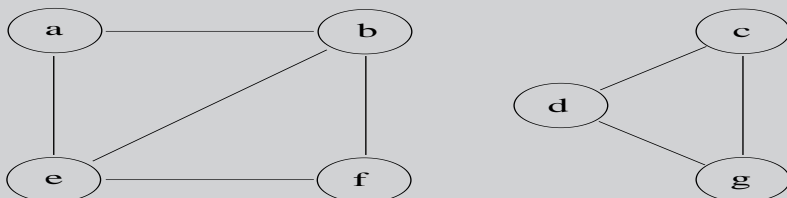
22

### Definition

- Let  $G$  be an undirected multigraph
- A sub-graph  $G'$  of  $G$  is a **spanning** forest of  $G$ , if
  - 1  $G'$  is a forest, and
  - 2 the partitionings of  $G$  resp.  $G'$  into connected components are the same.
- Then  $V' = V$

### Example

The following graph has  $8 \cdot 3 = 24$  spanning forests



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### Theorem (Kruskal's algorithm)

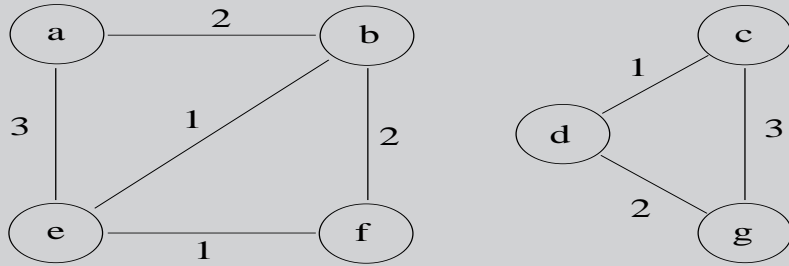
- 1 Let  $G = (V, E, r)$  be an undirected multigraph with weights  $b$
- 2 We want to construct a partitioning of  $V$  into connected components, and a set of edges  $F$  that constitutes a spanning forest of  $G$  having minimal weight  $\sum_{e \in F} b(e)$
- 3 We preprocess  $G$  by removing all loops and all parallel edges except for a single one of least weight
- 4 The algorithm then proceeds as follows, with complexity  $O(\#(V) \cdot \#(E))$

Set  $F = \emptyset$  and  $P = \{\{v\} \mid v \in V\}$   
 For  $i$  from 0 to  $m - 1$  repeat:  
 if the nodes  $v$  and  $u$  of  $e_i$  are in distinct blocks of  $P$ ,  
 combine both blocks of  $P$  and adjoin  $e_i$  to  $F$

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### Example

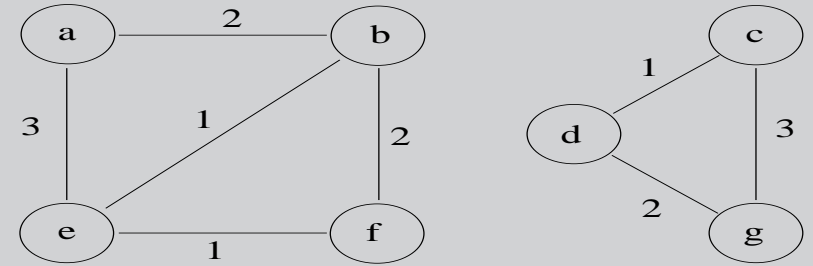
For the weighted graph



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### Example

For the weighted graph



Kruskal's algorithm starts with  $F = \emptyset$ ;  $P = \{\{a\}, \{b\}, \{c\}, \{d\}, \{e\}, \{f\}, \{g\}\}$  and terminates with

$$F = \{\{a, b\}, \{b, e\}, \{c, d\}, \{d, g\}, \{e, f\}\}$$

$$P = \{\{a, b, e, f\}, \{c, d, g\}\}$$

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### Proof.

- Let  $G_i$  be the sub-graph of  $G$  with  $V$  as nodes and edges  $\{e_0, e_1, \dots, e_i\}$

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- Therefore, after step  $i$ , the sub-graph having nodes  $V$  and edges  $F$  is a spanning forest of  $G_i$
- We show that the greedy strategy employed, yields a spanning forest of minimal weight

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### Proof (continued).

- Let  $F'$  be the set of edges of a spanning forest of minimal weight, and suppose  $F' \neq F$ ; then there exists an edge  $e_i$  in  $F$  not in  $F'$ .

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