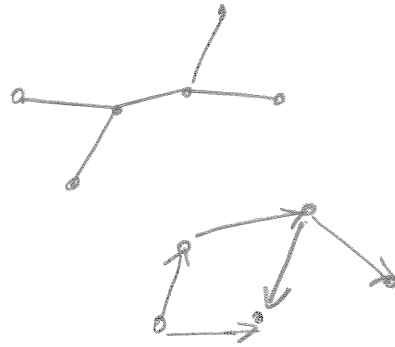
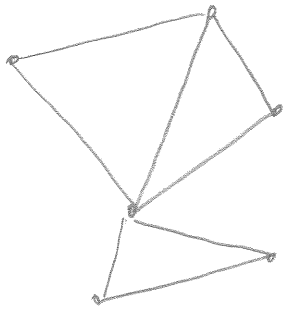


①

Graphs



consist of

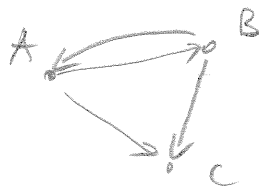
- vertices
- edges (undirected or directed)

Formally, $G = (V, E)$

$\begin{matrix} \text{set of} \\ \text{vertices} \end{matrix}$

$\begin{matrix} \text{set of} \\ \text{edges} \end{matrix}$

- directed edges: $E \subseteq \underbrace{V \times V}_{\text{pairs of vertices}}$



$V = \{A, B, C\}$

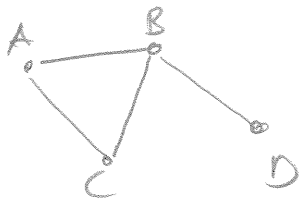
$E = \{(A, B), (A, C), (B, C)\}$

Digraph!

(2)

- undirected edges : $E \subseteq \mathcal{P}_2(V)$

set of all 2-element subsets of V



$$V = \{A, B, C, D\}$$

$$E = \{\{A, B\}, \{A, C\}, \{B, C\}, \{B, D\}\}$$

Let $|V| = n$. What is the maximal number of

- directed edges (without loops)

- undirected edges

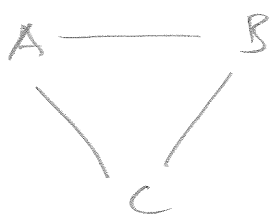
between nodes in V ?

A: $n(n-1)$ $n(n-1)/2$

How many digraphs/graphs?

A: $2^{n(n-1)}$ $2^{n(n-1)/2}$

Model undirected edges by 2 directed edges



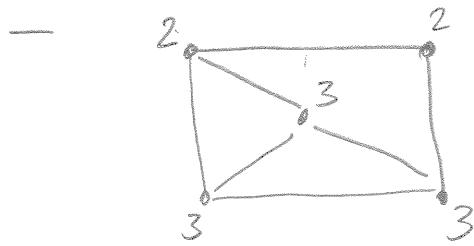
3

Terminology

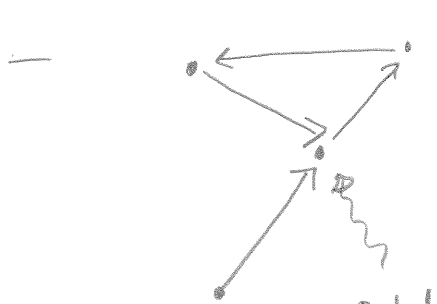


v is adjacent to u

$$(u, v) \in E$$



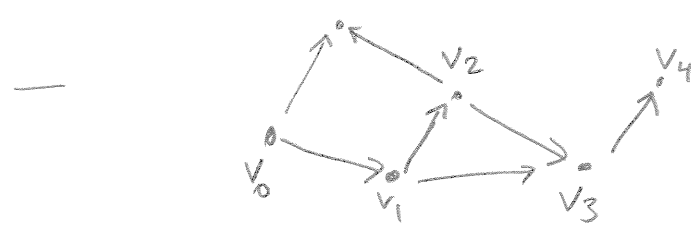
$\text{deg}(u)$ "degree of u"
= # adj. vertices



$\text{outdeg}(u)$ "outdegree"
= # outgoing edges

$\text{indeg}(u)$
= # incoming edges

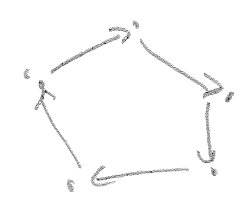
$$\begin{aligned} \text{outdeg}(\cdot) &= 1 \\ \text{indeg}(\cdot) &= 2 \end{aligned}$$



v_0, v_1, v_2, v_3, v_4 is a path

simple path: $v_i \neq v_j$ for $i \neq j$

cycle: $v_0 = v_m$, otherwise $v_i \neq v_j$ for $i \neq j$



(4)

- G undirected: G is connected if there is a path from u to v , f.a. $u, v \in V$ (strongly connected if digraph)



- $G' = (V', E')$ is a subgraph of $G = (V, E)$ if $V' \subseteq V, E' \subseteq E$ (and G' is a graph)

- Connected component of G

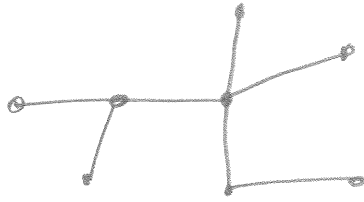


maximal connected subgraphs of G

(strongly connected component in digraph)

5

- Tree



connected graph without cycles

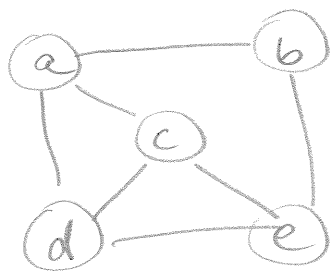
- Forest



all connected components are trees

6

Representing Graphs



Adjacency list for each vertex

a → [b c d]

b → [a e]

c → [a d e]

d → [a c e]

e → [b c d]

Space:

$$|V| + \sum_{v \in V} \deg(v)$$

$$= |V| + 2|E|$$

$$= \Theta(V + E)$$

↑ abuse of notation

How change for digraphs?

Adjacency matrix

	a	b	c	d	e
a	0	1	1	1	0
b	1	0	0	0	1
c	1	0	0	1	1
d	1	0	1	0	1
e	0	1	1	1	0

$$V = \{1, \dots, n\}$$

$$G = (V, E)$$

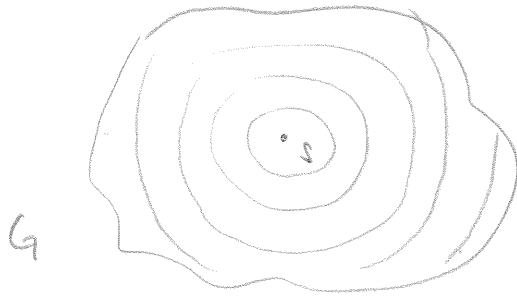
$$M(i,j) = \begin{cases} 1 & \text{if } (i,j) \in E \\ 0 & \text{otherwise} \end{cases}$$

... and for digraphs?

(7)

Breadth-First Search

$G = (V, E)$ undirected, $s \in V$ start node



Idea: 1st round: nodes v with $\text{dist}(s, v) = 1$
2nd round: nodes v with $\text{dist}(s, v) = 2$

where

$\text{dist}(s, v) =$ length of shortest path
from s to v

Technique:

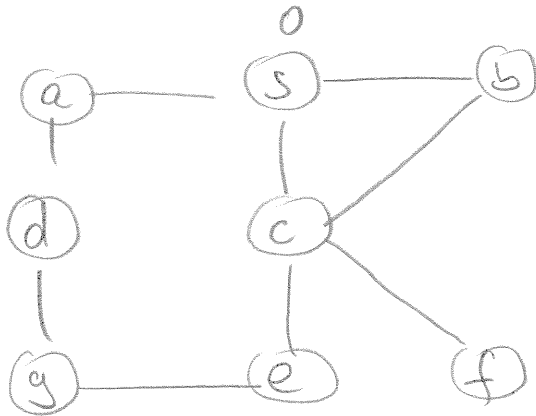
- nodes can have colours white, grey, black
- nodes have adj. list
- use FIFO queue

Also

- predecessors (\rightarrow spanning tree)
- $\text{dist}(s, v)$

(8)

Example:



Q: s

BFS(G, s)

for $u \in G.V$

$u.col = 'w'$

$u.dist = \infty$

$u.pred = nil$

$s.col = 'g'$; $s.dist = 0$

Q.init()

while not Q.isEmpty() do

$u := Q.dequeue()$

for v in $u.adj$ do

if $v.col = 'w'$

then $v.col = 'g'$;

$v.dist := u.dist + 1$

$v.pred := u$

Q.enqueue(v)

$u.col := 'b'$

} initialize

8a

Breadth-First Search (BFS) - Summary

- 3 colors for nodes
 - white: unexplored
 - gray: under exploration
 - black: finished
- undirected graph
- computes
 - distance from start node s : $\text{dist}(s, v)$
 - (some) spanning tree
- FIFO queue for nodes to explore

(9)

BFS Running Time

• Initialization	$\Theta(V)$
• Enqueue vertex if white	$\Theta(V)$
• Scan adj. list	$\Theta(E)$
	<hr/>
total	$\Theta(V+E)$

Correctness of BFS

1) $v.\text{dist} = \text{dist}(s, v)$ f.a. v

2) pred defines a spanning tree

ad 1) Proof in [CLRS]

ad 2) The graph defined by "pred" is

- connected

- cycle-free (due to dist:

$$v.\text{pred} = u \Rightarrow v.\text{dist} = u.\text{dist} + 1)$$

\Rightarrow tree

Consequence

- order of exploration of adjacent nodes does not matter

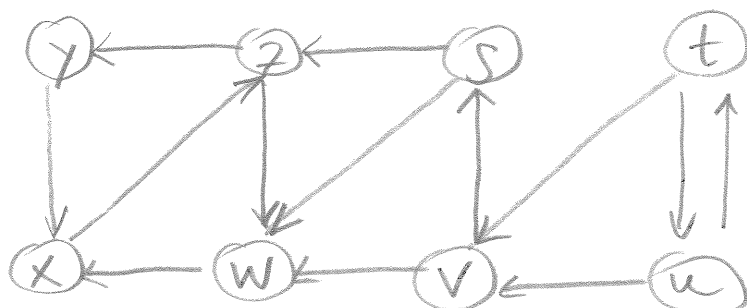
Depth-First Search

Technique

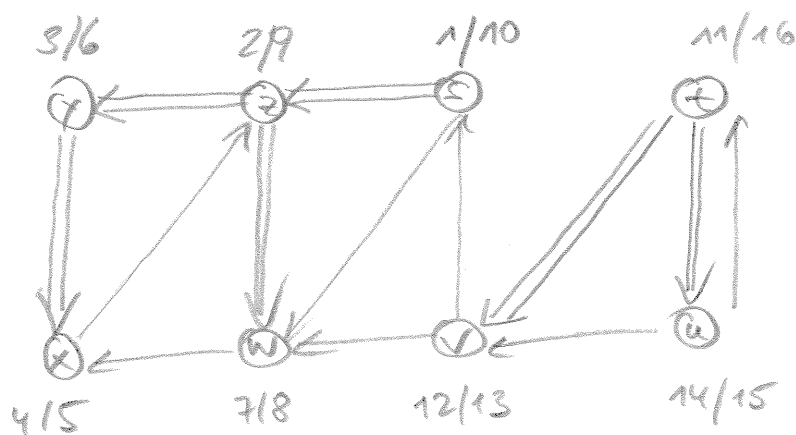
- recursive alg. \Rightarrow implicit stack
- also for disconnected graphs,
starts from all nodes
- nodes have fields st (start time),
et (end time)
- for digraphs (typically)

(11)

DFS: Example Graph



Traversal



Edge types

- Tree edges: 'g' \rightarrow 'w'
- Back edges: 'g' \rightarrow 'g' (indicate cycles)
- Forward edges: 'g' \rightarrow 'b', from ancestor to descendant
- Cross edges: 'g' \rightarrow 'b', otherwise

(12)

Parenthesization

Starttime at node v : $(v$ opening parenthesis

Endtime at node v : $v)$ closing parenthesis

For our traversal

1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
(s (z (y (x x) y) (w w) z) s) (t (v v) (u u) t)

Parentheses indicate tree structure



Theorem: For every DFS traversal, start and end times have a parenthesis structure

DFS Code

DFS-All(G)

for $u \in G.V.$ do $u.col := 'w'$ $u.pred := nil$

time := 0

for $u \in G.V.$ do if $u.col = 'w'$ then DFS(u)

} Initialization

DFS(u) $u.col := 'g'$

time ++

 $u.starttime := time$ for $v \in u.adj$ do if $v.col = 'w'$ then $v.pred := u$ DFS(v) $u.col := 'b'$

time ++

 $u.endtime := time$

DFS Running Time

• DFS - All

- initialization $\Theta(V)$ - calls to DFS $\Theta(V)$

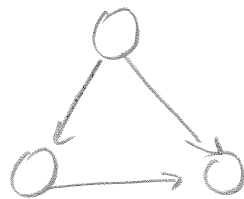
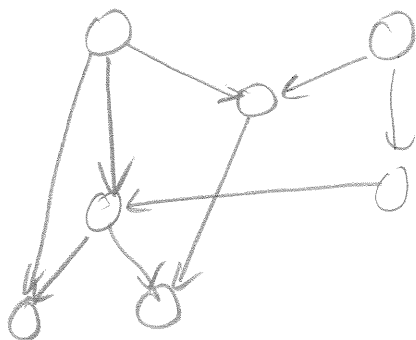
• DFS

- called once per vertex $\Theta(V)$ - explores all adjacent edges $\Theta(E)$

total $\Theta(V+E)$

DAGs and Topological Sorting

DAG = Directed Acyclic Graph



Model precedences: $x \rightarrow y = \text{"x before y"}$

DAGs and DFS

Theorem: G digraph. Then

G is a DAG \Leftrightarrow DFS yields no back edge ('g' \rightarrow 'g')

Proof: " \Rightarrow " (indirect)

Suppose $u \rightarrow v$ is back edge



v gray, u gray

\Rightarrow path $v \dots \rightarrow u$ (in DFS tree)

\Rightarrow edge $u \rightarrow v$ completes cycle

(16)

" \Leftarrow " (indirect)

Suppose G has cycle C

- Suppose v is first node in C discovered

- let u be pred of v in C

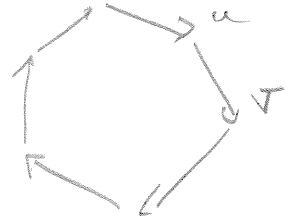
- When DFS discovers v , all of C is white

- Before return of $DFS(u)$, all nodes reachable on C are visited

$\Rightarrow u$ is visited after v

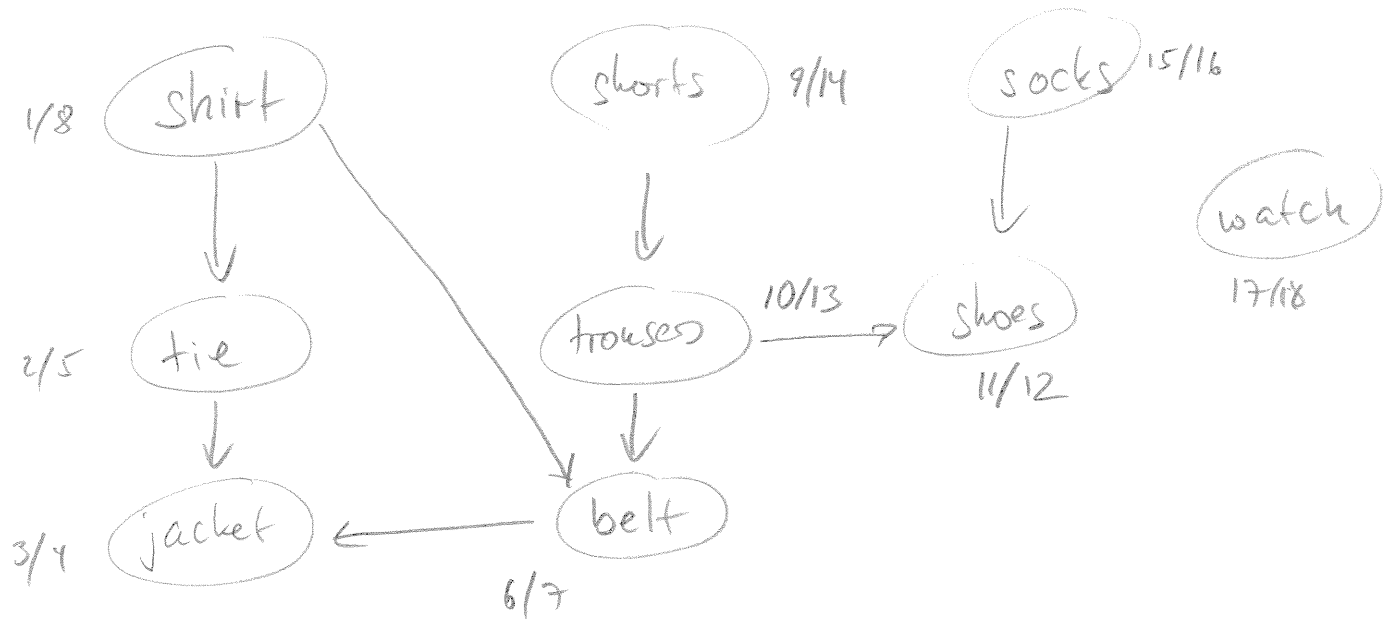
$\Rightarrow u$ is descendant of v

$\Rightarrow (u, v)$ is back edge



[Dressing Example]

Dressing Example



Topological Sorting

$G = (V, E)$ DAG.

Find linear ordering v_1, v_2, \dots, v_n of V

• sth. $(v_i, v_j) \in E \Rightarrow i < j$ (i.e., v_i before v_j .)

Idea: If $(u, v) \in G$, then v is finished before u

G DAG $\Rightarrow (u, v)$ is no back edge

\Rightarrow 2 cases when (u, v) is explored

- v is black $\Rightarrow \checkmark$
- v is white $\Rightarrow v$ descendant of u in DFS-tree $\Rightarrow \checkmark$

18

Topological Sorting: Algorithm

- Run DFS
- sort nodes according to finishing time in descending order