

Graph $G = (V, E)$

V : vertices: an
arbitrary finite
set of anything

E : edges: pairs of
elements of V
(i.e. vertices)

$u \rightarrow v$ (directed edge)

uv (undirected edge)

If edge e contains
vertices u & v :

u & v are adjacent

e is incident to u &
 v

u is a neighbor of v
(& vice versa)

degree of u is
neighbors (assume
no parallel edges)

If $u \rightarrow v$ is a directed
edge, u is the tail &
 v is the head.

u is a predecessor of v
 v is a successor of u .

in-degree: # predecessors
out-degree: # successors

Sometimes V is # vertices
& E is # edges

e.g. "an algo runs in

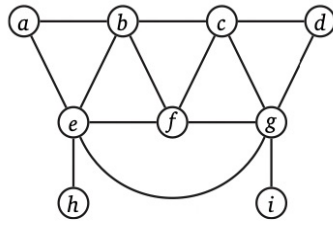
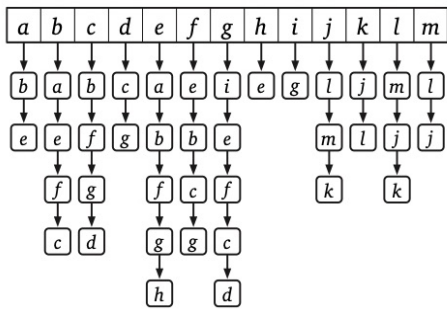
$O(V + E)$ time"

Data Structures

adjacency list:

an array indexed by
vertices or their
label

elements are lists
of adjacent vertices
(successors only if
 G is directed)



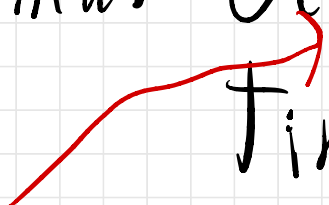
usually uses singly
linked lists for
adjacent vertices

each edge uv appears
twice if undirected

Space: $\Theta(V + E)$

Learn neighbors of
 u in optimal $O(\text{deg}(u))$

degree
of u (# neighbors)



Time.

Have to check u 's
whole list to know if

$u \rightarrow v$ exists!

Could use hash table
lists...

Adjacency matrix:

$|V| \times |V|$ matrix of

0s + 1s. Stored as

2D array $A[1..|V|, 1..|V|]$

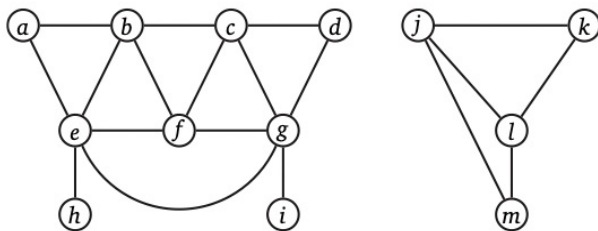
undirected: $A[u, v] = 1$

iff $uv \in E$

directed: $A[u, v] = 1$

iff $u \rightarrow v \in E$

	a	b	c	d	e	f	g	h	i	j	k	l	m
a	0	1	0	0	1	0	0	0	0	0	0	0	0
b	1	0	1	0	1	1	0	0	0	0	0	0	0
c	0	1	0	1	0	1	1	0	0	0	0	0	0
d	0	0	1	0	0	0	1	0	0	0	0	0	0
e	1	1	0	0	0	1	1	1	0	0	0	0	0
f	0	1	1	0	1	0	1	0	0	0	0	0	0
g	0	0	1	1	1	1	0	0	1	0	0	0	0
h	0	0	0	0	1	0	0	0	0	0	0	0	0
i	0	0	0	0	0	0	1	0	0	0	0	0	0
j	0	0	0	0	0	0	0	0	0	0	1	1	1
k	0	0	0	0	0	0	0	0	0	0	1	0	1
l	0	0	0	0	0	0	0	0	0	0	1	1	0
m	0	0	0	0	0	0	0	0	0	0	1	0	1



$\Theta(V^2)$ space.

Neighbors of u in
 $\Theta(V)$ time.

Check if uv exists
in $\Theta(1)$ time.

	Standard adjacency list (linked lists)	Fast adjacency list (hash tables)	Adjacency matrix
Space	$\Theta(V + E)$	$\Theta(V + E)$	$\Theta(V^2)$
Test if $uv \in E$	$O(1 + \min\{\deg(u), \deg(v)\}) = O(V)$	$O(1)$	$O(1)$
Test if $u \rightarrow v \in E$	$O(1 + \deg(u)) = O(V)$	$O(1)$	$O(1)$
List v 's (out-)neighbors	$\Theta(1 + \deg(v)) = O(V)$	$\Theta(1 + \deg(v)) = O(V)$	$\Theta(V)$
List all edges	$\Theta(V + E)$	$\Theta(V + E)$	$\Theta(V^2)$
Insert edge uv	$O(1)$	$O(1)^*$	$O(1)$
Delete edge uv	$O(\deg(u) + \deg(v)) = O(V)$	$O(1)^*$	$O(1)$

in expectation

Assume we're using
an adjacency list.

Graph $G' = (V', E')$ is
a subgraph of $G = (V, E)$

$$\text{if } V' \subseteq V \text{ + } E' \subseteq E.$$

walk: a sequence of edges
where successive edges share
a common vertex

path: a walk with no
repeated vertices

G is connected if there is
a walk between any pair
of vertices

Components: maximal
connected subgraphs of
 G

Given vertex s , a vertex
 u is reachable from s ,
if there is an s, u -walk.

Given s , what is reachable?

Whatever-first search:

uses a "bag" data structure

- supports adding objects

- removing added objects
(where we came from)

WHATEVERFIRSTSEARCH(s):

put (\emptyset, s) in bag

while the bag is not empty

take (p, v) from the bag (*)

if v is unmarked

mark v

$parent(v) \leftarrow p$

for each edge vw (†)

put (v, w) into the bag (**)

cycle: a walk that repeats only its first/last vertex

tree: a connected graph that has no cycles

spanning tree of G :

a subgraph of G that is a tree & contains every vertex

Lemma: Whatever First Search(s) marks exactly the vertices reachable from s .

The set of pairs

$(v, \text{parent}(v))$ where $\text{parent}(v) \neq \emptyset$

form a spanning tree of the component containing s .

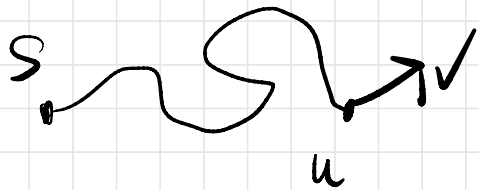
Proof: Each vertex marked at most once.

Show each reachable vertex is marked by induction on shortest path length from s .

s is marked right away.

If $v \neq s$ is reachable.

Let $s \rightarrow \dots \rightarrow u \rightarrow v$ be shortest path to v .



u is reachable & closer to s than v .

\Downarrow It implies u is marked.

So we add (u, v) to bag.
Guaranteed v is marked
after (u, v) is removed.

We only mark reachable vertices.

s is marked & reachable.

If we mark $v \neq s$.

Pair $(\text{parent}(v), v)$ is an
edge.

So we marked $\text{parent}(v)$ first.

By induction on order we
mark vertices, $\text{parent}(v)$
is reachable &

There is a walk

$$s \rightarrow \dots \rightarrow \text{parent}(v) \rightarrow v$$

Finally the $(\text{parent}(v), v)$ edges spanning the component of s .

All marked vertices except s has a parent, so one fewer edge than A vertices in component.

\Rightarrow the edges make a
Tree

WHATEVERFIRSTSEARCH(s):

put (\emptyset, s) in bag

while the bag is not empty

take (p, v) from the bag

if v is unmarked

mark v

$parent(v) \leftarrow p$

for each edge vw

put (v, w) into the bag

(*)

(†)

(**)

$\leq 2|E| + 1$
times

$O(|V|)$
times

T : time to add or remove from bag

$\leq 2|E|$
time

$O(V + ET)$ time

↑
unmark vertices

↑
put & pull from bag

Which bag?

stack: depth-first

spanning tree

long & skinny

$O(V+E)$

queue: breadth-first

(unweighted) spanning tree

shortest paths!

$O(V+E)$

priority queue: depending
on priorities:

- Prim's algo for
MST

- Dijkstra

- "widest" paths

with min-heap:

$$O(V + E \log E)$$

$$= O(V + E \log V)$$