Graphs

Lecture17

## Two techniques for algorithm design

- We have seen recursion techniques so far
- Next few weeks, we will see graph algorithms
- E.g. Dijkstra...


## Two techniques of algorithm design

- We have seen recursion techniques so far
- Next few weeks, we will see graph algorithms
- E.g. Dijkstra

e



## Graphs

- 8 vertices
- 10 edges
- 2 components
f

e

h


## Graph Representation

- 8 vertices
- 10 edges
- 2 components

e

Just a representation of the graph!
f

h

## Graph Definition

- A (simple) graph is
- Non empty finite set V , called vertex set
- Set E of pairs of vertices, called edges.
- Undirected $(u, v)=\{u, v\}$
- Directed $(u, v)=u \rightarrow v$


## Graph Representation

- 8 vertices
- 10 edges
- 2 components

e

Just a representation of the graph!
f

h

## Graph Representation

- 8 vertices
- 10 edges


## Planar Graph! independent of the representation

- 2 components
f

h


## Graph Representation

- 8 vertices
- 10 edges

Another representation: Intersection graph

- 2 components



## Graph Representation

- 8 vertices
- 10 edges

Another representation: Intervals

- 2 components


For $\mathrm{i}<j \quad \operatorname{LIS}(i, j)= \begin{cases}0 & \text { if } j>n \\ \operatorname{LIS}(i, j+1) & \text { if } A[i] \geq A[j] \\ \max \{\operatorname{LIS}(i, j+1), 1+\operatorname{LIS}(j, j+1)\} & \text { otherwise }\end{cases}$


For $i<j \quad \operatorname{LIS}(i, j)= \begin{cases}0 & \text { if } j>n \\ \operatorname{LIS}(i, j+1) & \text { if } A[i] \geq A[j] \\ \max \{\operatorname{LIS}(i, j+1), 1+\operatorname{LIS}(j, j+1)\} & \text { otherwise }\end{cases}$


## Recursion Tree (of Mergesort)



## Configuration graph (Tower of Hanoi)



Vertices=legal configurations of discs Edges = legal move
undirected, or directed pointing both ways


The configuration graph of the 4-disk Tower of Hanoi.

## DFA as graph



Labeled graph, With conditions

| $q$ | $\delta[q, 0]$ | $\delta[q, 1]$ | $A[q]$ |
| :---: | :---: | :---: | :---: |
| 0 | 0 | 1 | TRUE |
| 1 | 2 | 3 | FALSE |
| 2 | 4 | 0 | FALSE |
| 3 | 1 | 2 | FALSE |
| 4 | 3 | 4 | FALSE |

lookup table from transition function is data structure

## NFA as graph



Labeled graph, Without conditions

How to determine if NFA accepts anything? Can s reach an accepting state? DFS, reachability

# NFA to DFA (subset construction) 



Some times the graph given is not the right graph!

$$
V=2 Q
$$

$E=\{A \rightarrow B \mid$ for all $u$ in $A$ there is
$v$ in $B$ such that $u \rightarrow v\}$
This is a 16 node graph!


| $P$ | $\varepsilon$ | $\delta^{\prime}(P, 0)$ | $\delta^{\prime}(P, 1)$ | $q^{\prime} \in A^{\prime}$ |
| :---: | :---: | :---: | :---: | :---: |
| s | s | as | bs | No |
| as | as | ats | bs | No |
| bs | bs | as | bts | No |
| ats | ats | ats | bts | Yes |
| bts | bts | ats | bts | Yes |

# NFA to DFA (subset construction) 



Some times the graph given is not the right graph!

$$
V=2 Q
$$

$E=\{A \rightarrow B \mid$ for all $u$ in $A$ there is
$v$ in $B$ such that $u \rightarrow v\}$
This is a 16 node graph!
Incremental subset construction was running BFS in the DFA, though we were only explicitly given the NFA graph

## Graph Boilerplate

- When I design algorithm on a graph:
- $V=$ ?
- $\mathrm{E}=$ ?
- Problem
- Algorithm
- Running time in terms of original input


## Graph Algorithms

- "Given a graph G(V,E), do ..."
- What does that mean?
- How to represent a graph? (string is represented by array etc..)
- Two standard representations


## Adjacency Lists

Adjacency List (= Array of lists)

1

2

undirected graph

5


## Adjacency Lists

- Adjacency List (= Array of lists)

1
$\mathrm{O}(|\mathrm{V}|+|\mathrm{E}|)$ space

2


Why Adjacecny, lists?
Acces each node in $\mathrm{O}(1)$ time List edges at each node in $O(1)$ time each
5 Insert edge
Hard: is ( $u, v$ ) in $E$ ?
More efficient data structure? Why use linked lists?

## Adjacency Matrix

- Adjacency matrix Why use those at all?
$A(i, j)=1$ if $(i, j)$ edge
0 otherwise

O(1) time to decide if (u,v) edge Always $\mathrm{O}\left(\mathrm{n}^{2}\right)$ space!
$\mathrm{O}(\mathrm{V})$ time to list all the neighbors of a vertex u $\longleftarrow \vee$ even though there are only constant number of edges!

| Adjacency | Standard adjacency list <br> matrix | Adjacency list <br> (hash tables) lists) |  |
| :---: | :---: | :---: | :---: |
| Space | $\Theta\left(V^{2}\right)$ | $\Theta(V+E)$ | $\Theta(V+E)$ |
| Time to test if $u v \in E$ | $O(1)$ | $O(1+\min \{\operatorname{deg}(u), \operatorname{deg}(v)\})=O(V)$ | $O(1)$ |
| Time to test if $u \rightarrow v \in E$ | $O(1)$ | $O(1+\operatorname{deg}(u))=O(V)$ | $O(1)$ |
| Time to list the neighbors of $v$ | $O(V)$ | $O(1+\operatorname{deg}(v))$ | $O(1+\operatorname{deg}(v))$ |
| Time to list all edges | $\Theta\left(V^{2}\right)$ | $\Theta(V+E)$ | $\Theta(V+E)$ |
| Time to add edge $u v$ | $O(1)$ | $O(1)$ | $O(1)^{*}$ |
| Time to delete edge $u v$ | $O(1)$ | $O(\operatorname{deg}(u)+\operatorname{deg}(v))=O(V)$ | $O(1)^{*}$ |

## How to traverse a graph?

- Traversal in general: e.g. you have a data structure with pointers and you want to print it out once
- How to traverse a graph?

RECURSIVEDFS(v): if $v$ is unmarked mark $v$
for each edge $v w$ RecursiveDFS $(w)$

## How to traverse a graph?

RECURSIVEDFS( $v$ ):
if $v$ is unmarked mark $v$
for each edge $\nu w$ RecursiveDFS $(w)$
$\mathrm{O}(|\mathrm{V}|+|\mathrm{E}|)$ time
ITERATIVEDFS $(s):$ Push(s)
while the stack is not empty
$v \leftarrow$ POP
if $v$ is unmarked mark $v$ for each edge $v w$ Push( $w$ )

## How to traverse a graph?

TraVERSE( $s$ ):
put $s$ into the bag
while the bag is not empty
take $v$ from the bag
if $v$ is unmarked mark $v$ for each edge $v w$ put $w$ into the bag
stack $=$ LIFO (DFS)
Queue = FIFO (BFS)
Priority Queue = lightest out
Random, etc

## Whatever First Search

## Traverse $(s)$ :

## put $(\varnothing, s)$ in bag

while the bag is not empty take ( $p, v$ ) from the bag if $v$ is unmarked mark $v$

```
                parent (v)\leftarrowp
``` for each edge \(v w\)
stack \(=\) LIFO (DFS)
Queue = FIFO (BFS)
Priority Queue = lightest out
Random, etc

\section*{Whatever First Search}

Traverse(s) marks every vertex in a connected graph exactly once, and the set of pairs (v, parent(v)) with parent(v) not empty, defines a spanning tree of the graph

BFS tree has shortest paths from s!


BFS tree
```

