

# MA/CSSE 473

## Day 15

BFS

Topological Sort

Combinatorial  
Object Generation



## MA/CSSE 473 Day 15

- **HW 6** due tomorrow, **HW 7** Friday, Exam next Tuesday
- **HW 8** has been updated for this term. Due Oct 8
- **ConvexHull implementation problem** due Day 27 (Oct 21); assignment is available now
  - Individual assignment (I changed my mind, but I am giving you 3.5 weeks to do it)
- Schedule page now has my projected dates for all remaining reading assignments and written assignments
  - Topics for future class days and details of assignments 9-17 still need to be updated for this term
- **Student Questions**
  - DFS and BFS
  - Topological Sort
  - Combinatorial Object Generation - Intro



Q1

## Recap: Pseudocode for DFS

### ALGORITHM $DFS(G)$

```
//Implements a depth-first search traversal of a given graph
//Input: Graph  $G = (V, E)$ 
//Output: Graph  $G$  with its vertices marked with consecutive integers
//in the order they've been first encountered by the DFS traversal
mark each vertex in  $V$  with 0 as a mark of being "unvisited"
count  $\leftarrow 0$ 
for each vertex  $v$  in  $V$  do Graph may not be connected, so we loop.
    if  $v$  is marked with 0
        dfs( $v$ )

dfs( $v$ )
//visits recursively all the unvisited vertices connected to vertex  $v$  by a path
//and numbers them in the order they are encountered
//via global variable count
count  $\leftarrow$  count + 1; mark  $v$  with count
for each vertex  $w$  in  $V$  adjacent to  $v$  do Backtracking happens when this loop ends (no more unmarked neighbors)
    if  $w$  is marked with 0
        dfs( $w$ )
```

**Analysis?**



**Q2**

## Notes on DFS

- DFS can be implemented with graphs represented as:
  - adjacency matrix:  $\Theta(|V|^2)$
  - adjacency list:  $\Theta(|V| + |E|)$
- Yields two distinct ordering of vertices:
  - order in which vertices are first encountered (pushed onto stack)
  - order in which vertices become dead-ends (popped off stack)
- Applications:
  - check connectivity, finding connected components
  - Is this graph acyclic?
  - finding articulation points, if any (advanced)
  - searching the state-space of problem for (optimal) solution (AI)



**Q3**

## Breadth-first search (BFS)

- Visits graph vertices by moving across to all the neighbors of last visited vertex. Vertices closer to the start are visited early
- Instead of a stack, BFS uses a queue
- Level-order tree traversal is a special case of BFS
- “Redraws” graph in tree-like fashion (with tree edges and cross edges for undirected graph)

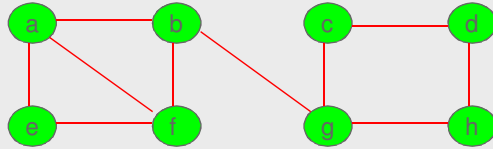


## Pseudocode for BFS

```
ALGORITHM BFS(G)  
//Implements a breadth-first search traversal of a given graph  
//Input: Graph  $G = \{V, E\}$   
//Output: Graph  $G$  with its vertices marked with consecutive integers  
//in the order they have been visited by the BFS traversal  
mark each vertex in  $V$  with 0 as a mark of being “unvisited”  
count  $\leftarrow$  0  
for each vertex  $v$  in  $V$  do  
    if  $v$  is marked with 0  
        bfs( $v$ )  
  
bfs( $v$ )  
//visits all the unvisited vertices connected to vertex  $v$  by a path  
//and assigns them the numbers in the order they are visited  
//via global variable count  
count  $\leftarrow$  count + 1; mark  $v$  with count and initialize a queue with  $v$   
while the queue is not empty do  
    for each vertex  $w$  in  $V$  adjacent to the front vertex do  
        if  $w$  is marked with 0  
            count  $\leftarrow$  count + 1; mark  $w$  with count  
            add  $w$  to the queue  
        remove the front vertex from the queue
```



## Example of BFS traversal of undirected graph



BFS traversal queue:

BFS tree:



Q4

## Notes on BFS

- BFS has same efficiency as DFS and can be implemented with graphs represented as:
  - adjacency matrices:  $\Theta(V^2)$
  - adjacency lists:  $\Theta(|V| + |E|)$
- Yields single ordering of vertices (order added/deleted from queue is the same)
- Applications: same as DFS, but can also find shortest paths (smallest number of edges) from a vertex to all other vertices



Q5

## DFS and BFS

**TABLE 5.1** Main facts about depth-first search (DFS) and breadth-first search (BFS)

	<b>DFS</b>	<b>BFS</b>
Data structure	stack	queue
No. of vertex orderings	2 orderings	1 ordering
Edge types (undirected graphs)	tree and back edges	tree and cross edges
Applications	connectivity, acyclicity, articulation points	connectivity, acyclicity, minimum-edge paths
Efficiency for adjacent matrix	$\Theta( V ^2)$	$\Theta( V ^2)$
Efficiency for adjacent lists	$\Theta( V  +  E )$	$\Theta( V  +  E )$



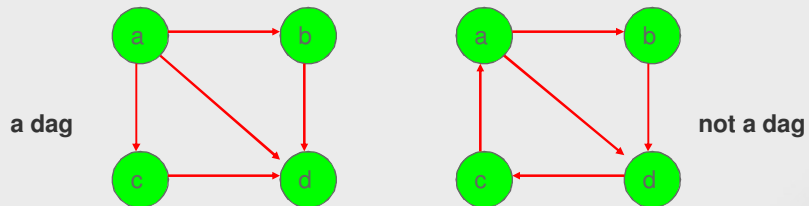
## Directed graphs

- In an undirected graph, each edge is a "two-way street".
  - The adjacency matrix is symmetric
- In an directed graph, each edge goes only one way.
  - $(a,b)$  and  $(b,a)$  are separate edges.
  - One such edge can be in the graph without the other being there.



## Dags and Topological Sorting

A *dag*: a directed acyclic graph, i.e. a directed graph with no (directed) cycles



Dags arise in modeling many problems that involve prerequisite constraints (construction projects, document version control, compilers)

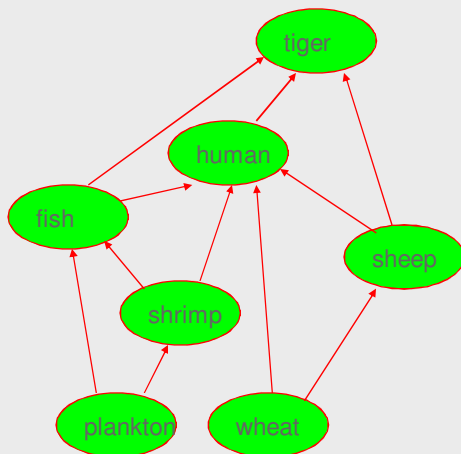
The vertices of a dag can be linearly ordered so that for every edge its starting vertex is listed before its ending vertex (**topological sort**).

A graph must be a dag in order for a topological sort of its vertices to be possible.



## Topological Sorting Example

Order the following items in a food chain

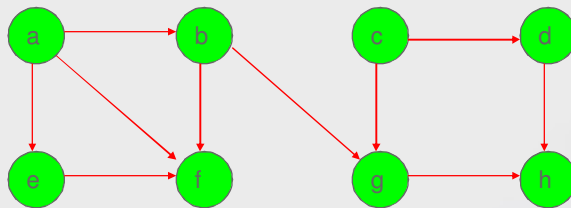


## DFS-based Algorithm

### DFS-based algorithm for topological sorting

- Perform DFS traversal, noting the order vertices are popped off the traversal stack
- Reversing order solves topological sorting problem
- Back edges encountered? → NOT a dag!

Example:



Efficiency:



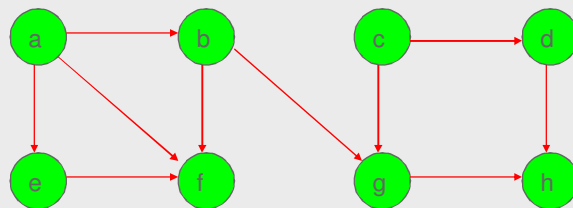
Q8

## Source Removal Algorithm

### Source removal algorithm

Repeatedly identify and remove a *source* (a vertex with no incoming edges) and all the edges incident to it until either no vertex is left (problem is solved) or there is no source among remaining vertices (not a dag)

Example:



Efficiency: same as efficiency of the DFS-based algorithm



Q9

## Application: Spreadsheet program

- What is an allowable order of computation of the cells' values?

	A	B	C
1	=C4-7	4	=C4+6
2	=A3+A1-C4	=1+B1	=B1-A4
3	7	=A3*C2-B2	=B3+A3
4	=A1*B1*A2	=C2-A4	9



Q10-12

## Cycles cause a problem!

	A	B	C
1	=C4-7	4	=C4+6
2	=A3+A1-C4	=1+B1	=B1-A4
3	7	=A3*C2-B2	=B3+A3
4	=A1*B1*A2	=C2-A4	9



(We may not get to this today)

Permutations

Subsets

## COMBINATORIAL OBJECT GENERATION



## Combinatorial Object Generation

- Generation of permutations, combinations, subsets.
- This is a big topic in CS
- We will just scratch the surface of this subject.
  - Permutations of a list of elements (no duplicates)
  - Subsets of a set



## Permutations

- We generate all permutations of the numbers  $1..n$ .
  - Permutations of any other collection of  $n$  distinct objects can be obtained from these by a simple mapping.
- How would a "decrease by 1" approach work?
  - Find all permutations of  $1..n-1$
  - Insert  $n$  into each position of each such permutation
  - We'd like to do it in a way that minimizes the change from one permutation to the next.
  - It turns out we can do it so that we always get the next permutation by swapping two adjacent elements.



## First approach we might think of

- for each permutation of  $1..n-1$ 
  - for  $i=0..n-1$ 
    - insert  $n$  in position  $i$
- That is, we do the insertion of  $n$  into each smaller permutation from left to right each time
- However, to get "minimal change", we alternate:
  - Insert  $n$  L-to-R in one permutation of  $1..n-1$
  - Insert  $n$  R-to-L in the next permutation of  $1..n-1$
  - Etc.



## Example

- Bottom-up generation of permutations of 123

start	1		
insert 2 into 1 right to left	12	21	
insert 3 into 21 right to left	123	132	312
insert 3 into 21 left to right	321	231	213

**FIGURE 5.12** Generating permutations bottom up

- Example: Do the first few permutations for n=4



## Johnson-Trotter Approach

- integrates the insertion of n with the generation of permutations of 1..n-1
- Does it by keeping track of which direction each number is currently moving

→ ← → ←  
3241

The number k is **mobile** if its arrow points to an adjacent element that is smaller than itself.

- In this example, 4 and 3 are mobile
- We exchange the largest mobile number with its neighbor



## Johnson-Trotter Driver

```
def main():
    p = Permutation(4)
    list = []
    next = p.next()
    while next:
        list += [next]
        next = p.next()
    print list
```



## Johnson-Trotter background code

```
left = - 1 # equivalent to the left- and
right = 1 # right-pointing arrows in the book

def swap(list1, list2, i, j):
    "Swap positions i and j in both lists"
    list1[i], list1[j] = list1[j], list1[i]
    list2[i], list2[j] = list2[j], list2[i]

class Permutation:
    "Set current to the unpermuted list, and all directions pointing left"
    def __init__(self, n):
        self.current = range(1, n + 1)
        self.direction = [left] * n
        self.n = n
        self.more = True # This is not the last permutation.
```



## Johnson-Trotter major methods

```
def isMobile(self, k):
    ''' An element of a permutation is mobile if its direction "arrow"
        points to an element with a smaller value. '''
    return k + self.direction[k] in range(self.n) and \
           self.current[k + self.direction[k]] < self.current[k]

def next(self):
    '''return current permutation and calculate next one'''
    if not self.more:
        return False
    returnValue = [self.current[i] for i in range(self.n)]

    largestMobile = 0
    for i in range(self.n):
        if self.isMobile(i) and self.current[i] > largestMobile:
            largestMobile = self.current[i]
            largePos = i

    if largestMobile == 0:
        self.more = False # This is the last permutation
    else:
        swap(self.current, self.direction,
             largePos, largePos + self.direction[largePos])
        for i in range(self.n):
            if self.current[i] > largestMobile:
                self.direction[i] *= -1

    return "".join([str(v) for v in returnValue])
```



## Lexicographic Permutation Generation

- Generate the permutations in "natural" order.
- Let's do it recursively.

