



CSE332: Data Abstractions

Section 6

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Winter 2014

Section Agenda

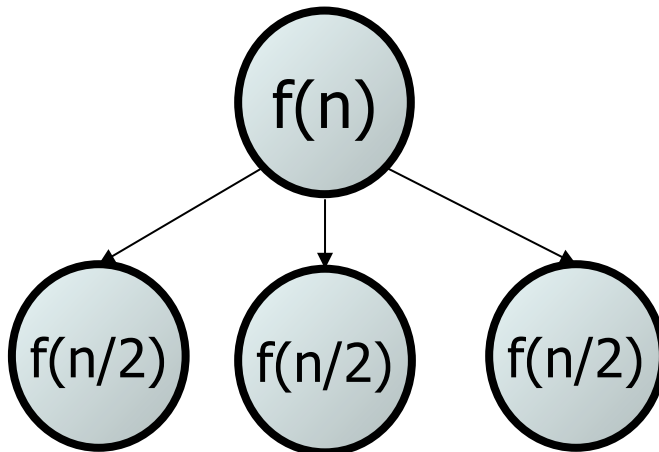
- **Another View of Recurrence**
- **Graph Review**
 - Graph Terminologies
 - Graph Representations: matrix & list
 - Topological sort
 - Graph traversal: BFS, DFS
- **Project 3 Introduction**
 - Analyzing US census data

Recurrence Relations

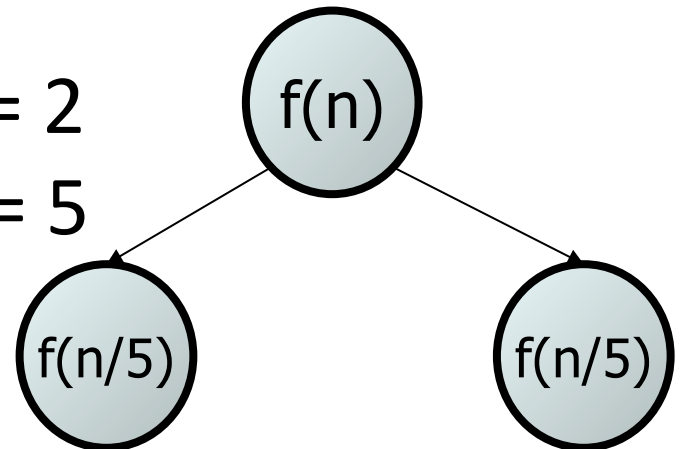
- $T(n) = a * T(n / b) + f(n)$

- a: Branching factor
- b: Work reduction
- f(n): Work

a = 3
b = 2



a = 2
b = 5



Graphs

Graph terminology

Graphs

- **$G = (V, E)$**

Contains set of vertices and set of edges

- $|V|$ = number of vertices
- $|E|$ = number of edges

Max $|E|$ for undirected graph

$$|V| + (|V| - 1) + (|V| - 2) + \dots + 1 = |V|(|V| + 1) / 2$$

Max $|E|$ for directed graph

$$|V| + |V| + |V| + \dots + |V| = |V| * |V| = |V|^2$$

Graph Terms

- **Path**

List of vertices $[v_0, v_1, \dots, v_n]$, such that $(v_i, v_{i+1}) \in E$ for all $0 \leq i < n$

- Path length = number of edges on path
- Path cost = sum of all edge weights on path

- **Cycle**

A path that begins and ends at the same node

Undirected Graph

- **Edges have no directions**

- **Connected**

If there is a path between all pairs of vertices

- **Fully Connected**

If there is an edge between all pairs of vertices

Directed Graph

- **Edges have direction**

- **Weakly Connected**

If there is an undirected path between all pairs of vertices

- **Strongly Connected**

If there is a directed path between all pairs of vertices

- **Fully Connected**

If there is edge (both way) between all pairs of vertices

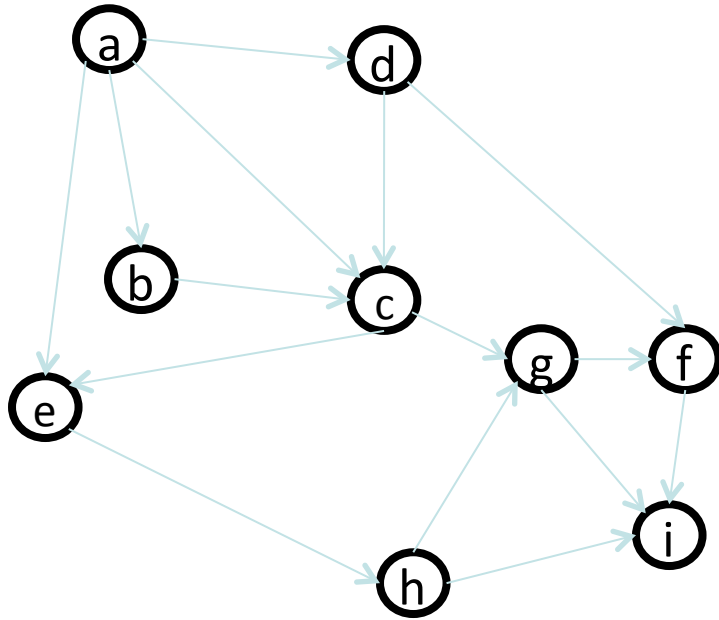
Graph Representation

Adjacency matrix & Adjacency list

Graph Representation

- **The 'Best one' depends on:**
 - Graph density
 - Common Queries
 - Insert an edge
 - Delete an edge
 - Find an edge
 - Compute in-degree of a vertex
 - Compute out-degree of a vertex

Adjacency Matrix



f\t	a	b	c	d	e	f	g	h	i
a		1	1	1	1				
b			1						
c					1		1		
d			1			1			
e								1	
f									1
g						1			1
h							1		1
i									

- Space Requirement: $|V|^2$

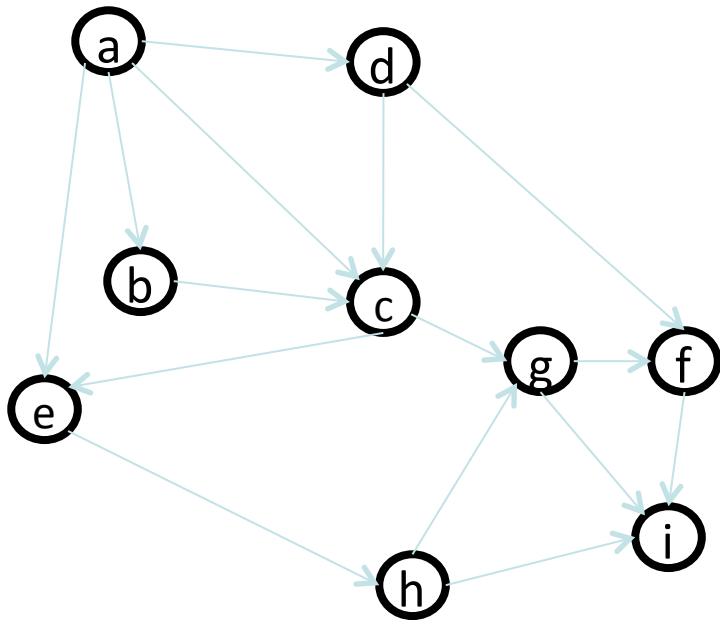
Adjacency Matrix

- Get in-degree: $O(|V|)$
- Get out-degree: $O(|V|)$
- Find an edge: $O(1)$
- Insert an edge: $O(1)$
- Delete an edge: $O(1)$

f\t	a	b	c	d	e	f	g	h	i
a		1	1	1	1				
b			1						
c					1		1		
d			1			1			
e								1	
f									1
g						1			1
h							1		1
i									

- Dense graph $|E| \gg |V|$, so good for dense graph

Adjacency List



a	b	c	d	e
b	c			
c	e	g		
d	c	f		
e	h			
f	i			
g	f	i		
h	g	i		
i				

- **Space Requirement:** $O(|V| + |E|)$

Adjacency List

- Let d = ave out-degree
- Get in-degree: $O(|V| + |E|)$
- Get out-degree: $O(d)$, $O(1)$ possible
- Find an edge: $O(d)$
- Insert an edge: $O(d)$
- Delete an edge: $O(d)$

a	b	c	d	e
b	c			
c	e	g		
d	c	f		
e	h			
f	i			
g	f	i		
h	g	i		
i				

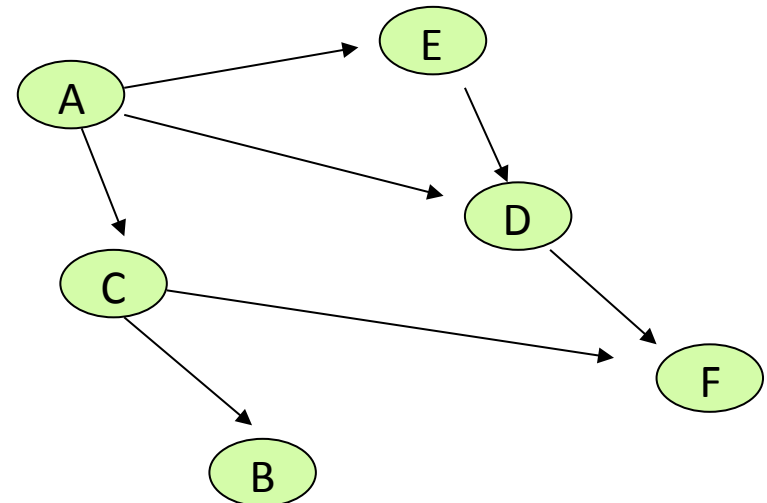
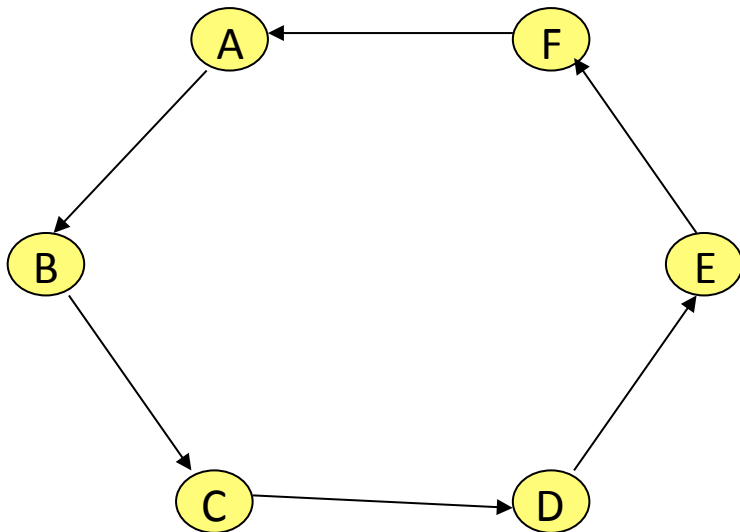
- Sparse graph $|V| \gg d$, so good for sparse graph

Topological Sort

Get linear order of tasks
with dependencies

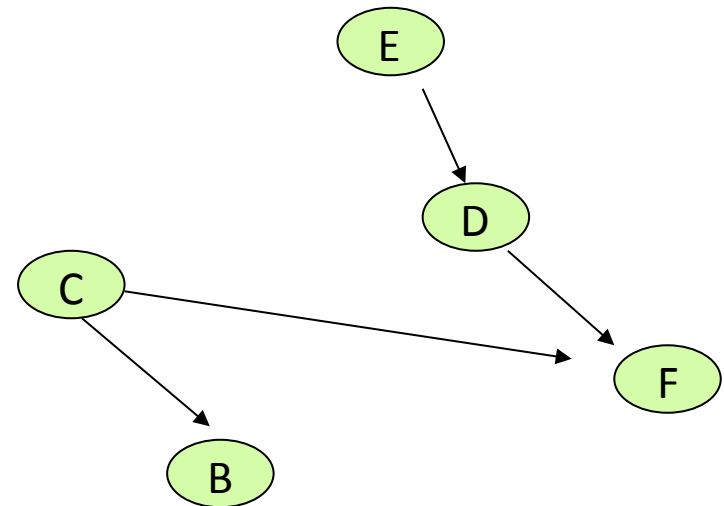
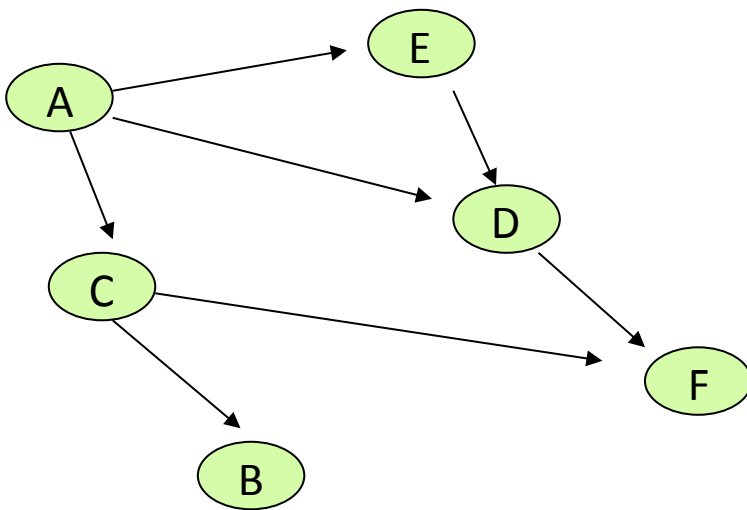
Topological Sort

- Given a set of tasks with precedence constraints, find a linear order of the tasks
 - No topological ordering in graph with cycle
 - Possible to have many topological ordering

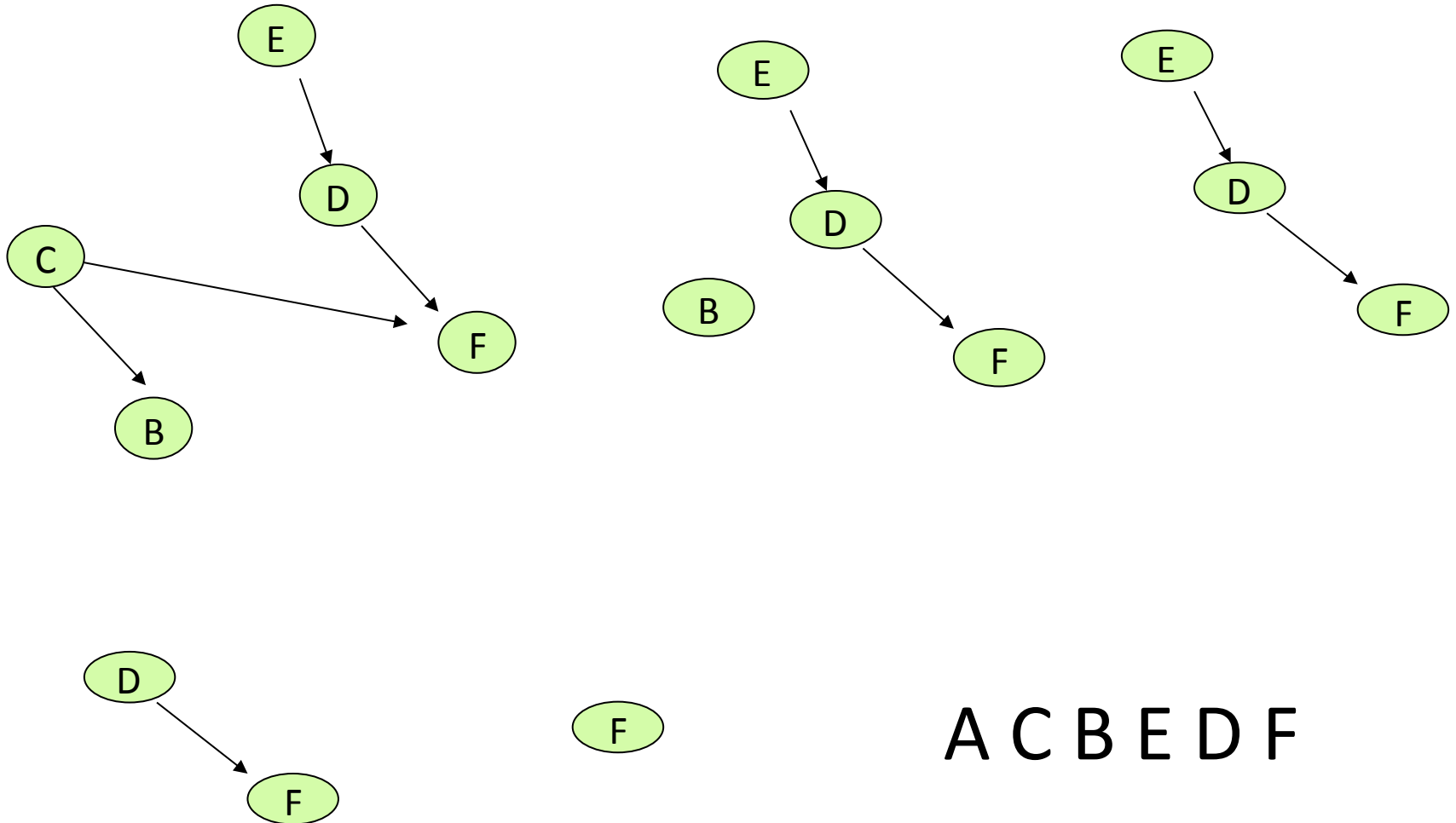


Topological Sort

- **Topological sort algorithm**
 - Choose a vertex v with in-degree 0
 - Output v & Remove v and all of its edges
 - Repeat until no more vertices left



Topological Sort



Topological Sort

- **Topological sort Runtime**

- Choose a vertex v with in-degree 0

Single step (No Q / Q):

$O(|V|)$

$O(1)$

Total (No Q / Q):

$O(|V|^2)$

$O(|V|)$

- Output v & Remove v

Total:

$O(|V|)$

- Remove all of v 's edges

Total:

$O(|E|)$

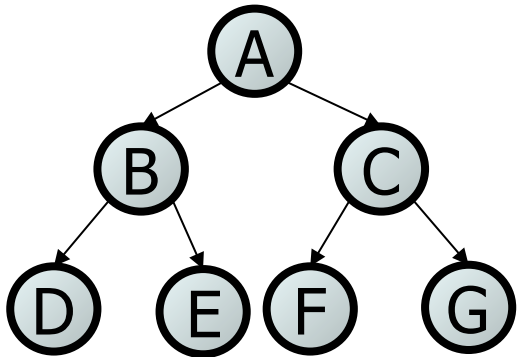
- **Total Runtime:** $O(|V|^2 + |E|) \sim O(|V|^2)$ No Queue
 $O(|V| + |E|)$ Queue

Graph Traversal

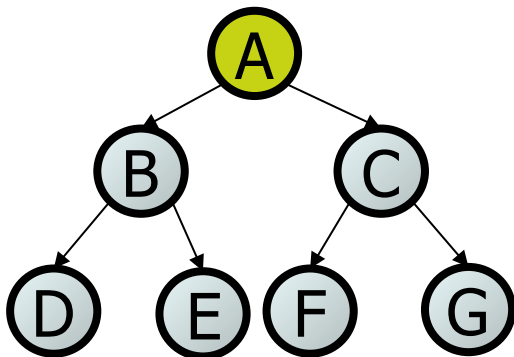
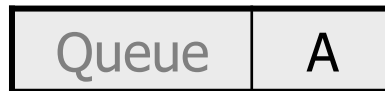
BFS & DFS

Breadth First Search

- **Pick the shallowest unmarked node**
 - Use queue, new node go to the end



Start with the root in the queue

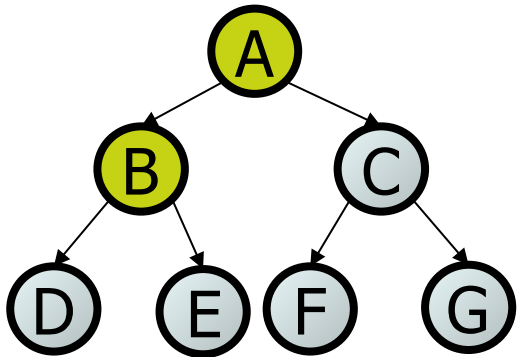


Pop one out, mark it,
put its child into the queue



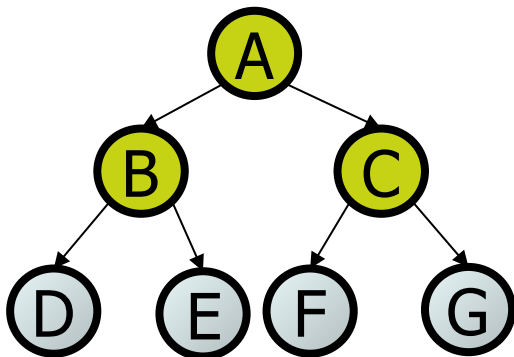
Breadth First Search

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Pop one out, mark it,
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Queue	C	D	E
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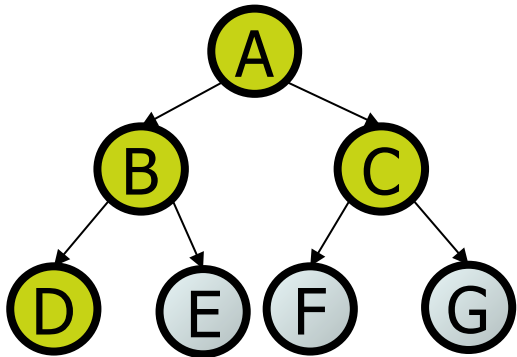


Pop one out, mark it,
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Queue	D	E	F	G
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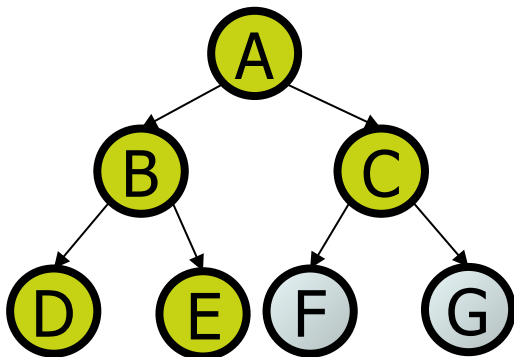
Breadth First Search

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Queue	E	F	G
-------	---	---	---

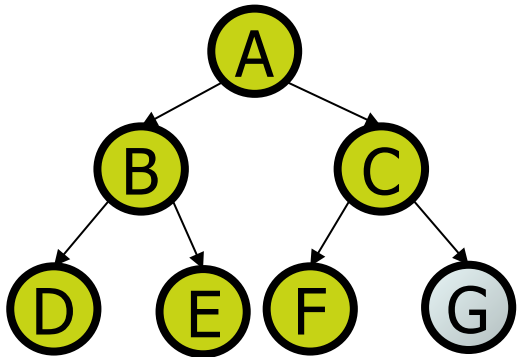


Pop one out, mark it,
put its child into the queue

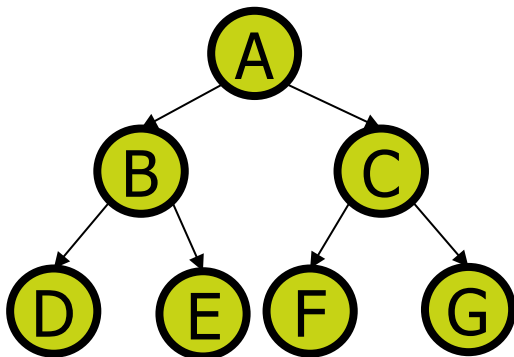
Queue	F	G
-------	---	---

Breadth First Search

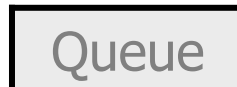
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Pop one out, mark it,
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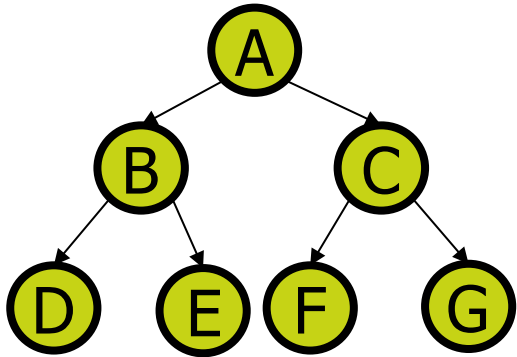
Pop one out, mark it,
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Breadth First Search

- **Pick the shallowest unmarked node**

- Use queue, new node go to the end



The queue is empty, Done!

Queue

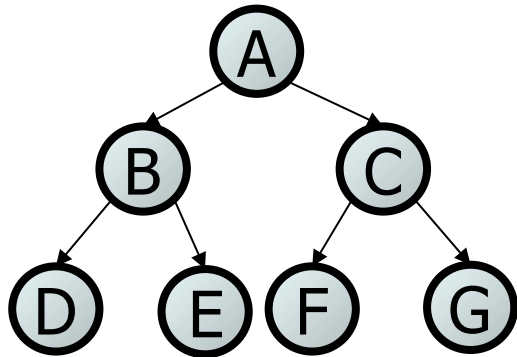
- The order of traversal: A B C D E F G

- Let b = branching factor, h = height

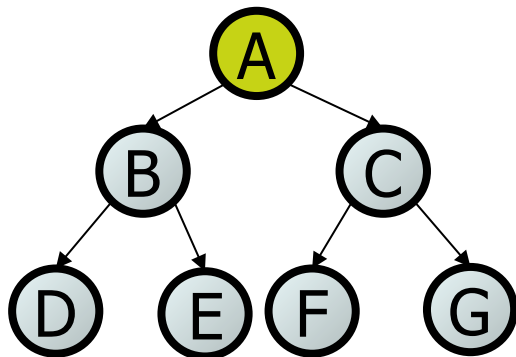
Space requirement: $O(b^h)$

Depth First Search

- **Pick the deepest unmarked node**
 - Use stack, new node go to the top



Start with the root in the stack

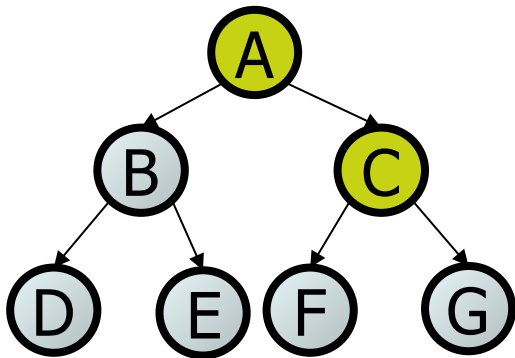


Pop one out, mark it,
put its child into the stack

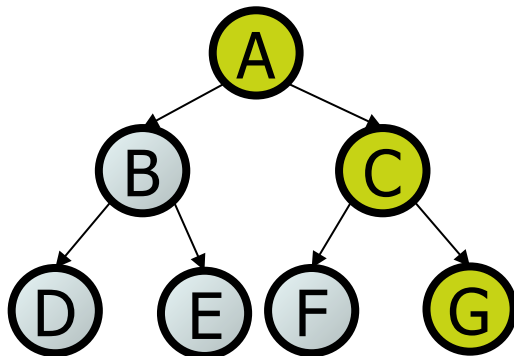
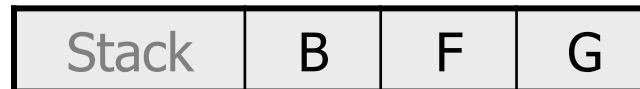


Depth First Search

- **Pick the deepest unmarked node**
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Pop one out, mark it,
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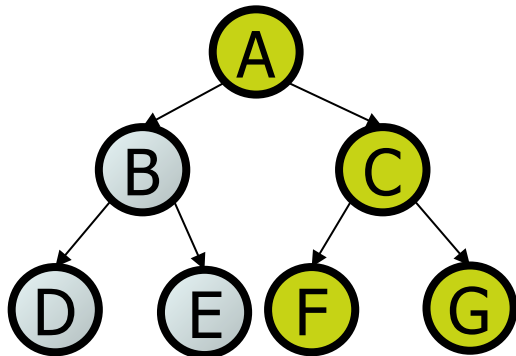


Pop one out, mark it,
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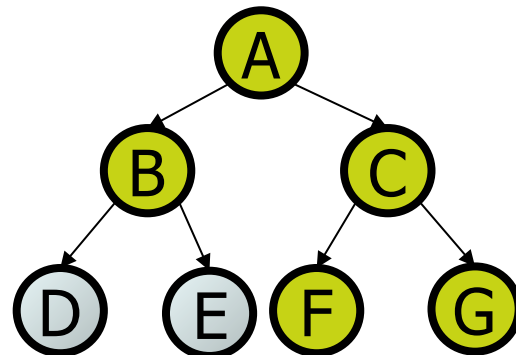


Depth First Search

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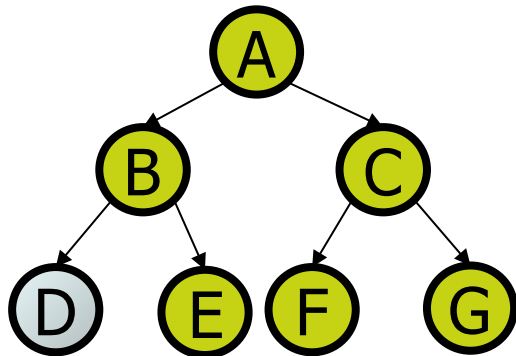


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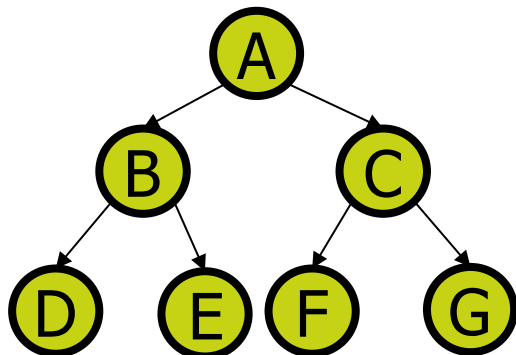


Depth First Search

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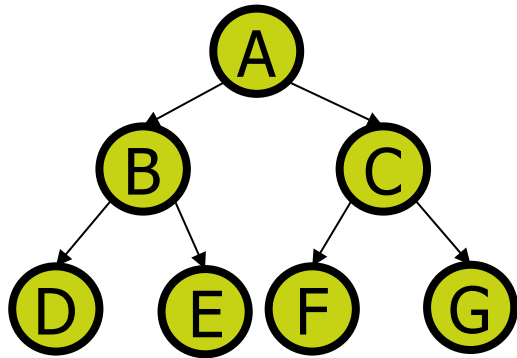


Pop one out, mark it,
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Depth First Search

- **Pick the deepest unmarked node**
 - Use stack, new node go to the top



The stack is empty, Done!

Stack

- The order of traversal: A C G F B E D
- Let b = branching factor, h = height
Space requirement: $O(b \cdot h)$

Project 3

Where are the people?

Project 3 – Find Partner

- **Form 2 person team**
- Use discussion board to find partner
<https://catalyst.uw.edu/gopost/area/swansond/127023>
- Complete catalyst survey to form team by Friday February 21st
(Only one survey per team!)
<https://catalyst.uw.edu/webq/survey/kainby87/225338>
- You still need complete survey even if you keep your partner from project 2

Project 3

- US Census Bureau

state	county	population	latitude	longitude
01	001	1188	+32.48103	-86.486781
01	001	733	+32.465409	-86.486868
01	001	857	+32.479465	-86.473928
31	055	772	+41.262168	-95.982255
31	055	978	+41.265888	-95.963541
31	055	743	+41.261542	-95.968029
31	055	756	+41.265632	-95.970912
72	153	1827	+18.048574	-66.88596
72	153	3456	+18.058711	-66.875287
72	153	1444	+18.061441	-66.8652
72	153	2097	+18.04479	-66.865791
72	153	2677	+18.038417	-66.865411

Treat towns as points

Project 3

- US Census Bureau



1. Divide US with X by Y Grid
2. Compute Population in selected Rectangle

Project 3

- US Census Bureau



Population: 26360678

Percentage of total US: 9.24%

Project 3

- **Five different implementation**

1. Simple & Sequential

2. Simple & Parallel

3. Smarter & Sequential

4. Smarter & Parallel

5. Smarter & Lock-Based

} **Phase A**

} **Phase B**

- **Experiments & Write up**

Phase C

- Compare 5 versions with different queries