

CS3000

5/31 - Weds

Admin

- Long Hw 3 are today 9pm
- Long Hw 4 out tom, are 6/6
- Tomorrow - for optional recitation

Agenda

1. Amortized analysis
2. Aggregate analysis example
3. Graph representation

Recap

$$\sum_{i=0}^n 2^i = 1 + 2 + 4 + \dots \quad '2^n = 2^{n+1} - 1$$

$$(ex) \quad 1 + 2 + 4 + 8 + 16 = 31 = 2^5 - 1$$

$2^0 \qquad \qquad \qquad 2^4$

1. Amortized Analysis

$T(n)$ = # steps on input of size n

Sequence of operations \rightsquigarrow worst case

(ex) $\Theta(n)$

Traditional
w.c.
analysis

$\left\{ \begin{array}{l} n \text{ of these operations} \\ \hookrightarrow \Theta(n^2) \end{array} \right.$

Amortized version:

- sequence of operations
- worst case can't possibly happen every time
- count the # times the worst case happens over a sequence of n operations
- get a new total run-time, and per-operation run time

Trip to Data Structures/Systems

• let $A[1..n]$ be a new array (allocation)

• Insert at:

pos1
pos2
pos3
:
posn

$\left\{ \right.$ each insert costs $\Theta(1)$

- (all insert again, new want position $n+1$)

↳ need to allocate new array!
new array has size $2n$

$A[1..2n]$ → copy over elements
from old array to
new array

cost: $n+1$ worst case

Traditional w.c. analysis:

$\Theta(n)$ in worst case for one insert

A sequence of n insert operations: $\Theta(n^2)$

2. Aggregate Analysis

- simplification: don't worry about cost of allocation/deallocation
- aggregate: look at cost of all n operations,
not just worst case of one at a time

Start:

insert: 

1st insert

cost: 1

insert: 

2nd insert

cost: 2

insert: 

3rd insert

cost: 3

insert: 

4th insert

cost: 1

insert: 

5th insert

cost: 5

i	1	2	3	4	5	6	7	8	9
cost	1	2	3	1	5	1	1	1	9
size	1	2	4	4	8	8	8	8	16

• worst case does happen

(next worst case)

• but, not every single time!

when $i=17$

in general:

worst case when $i = 2^k + 1$ for some k

otherwise, cost is 1

Agg. analysis

Add all the i 's together when it costs i , and all the 1s together

otherwise

- What's total cost of worst case?

$$\sum_{j=0}^{\lg n} 2^j = 2^{\lg n + 1} - 1 = \Theta(n)$$

- What's total cost of non-worst case?

$n - \lg n$ of these

$\leq n$ of these

- In total over n operations?

$$\leq \Theta(n) + n$$

$$= \Theta(n)$$

• per operation?

$\Theta(1)$

• Generalization } sequence of n operations in which the i th operation costs i if i is a power of 2, and 1 otherwise

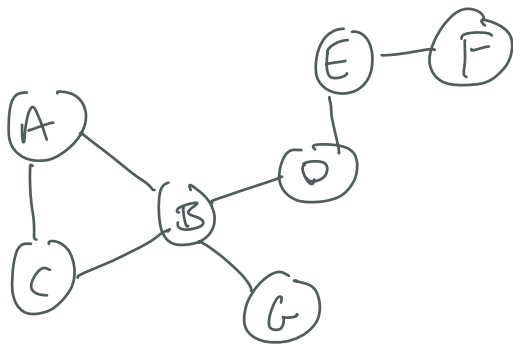
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2. Graph Intro

Assumptions:

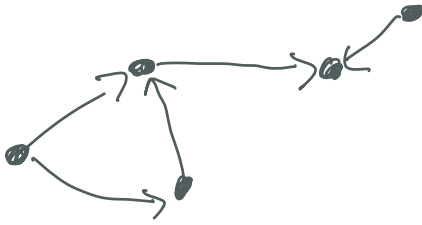
- we know graphs are important
- we know some stuff about graphs
 - ↳ focus on how we implement graph algorithms, run-time, space, etc.

What do we know about
this graph?

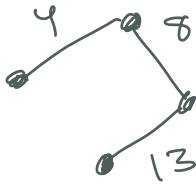


- has 2 cycle
- unweighted
- undirected
- 7 vertices / nodes
- 7 edges
- connected (path from u to v)
- break ties alphabetically
- $\text{deg}(B) = 4$

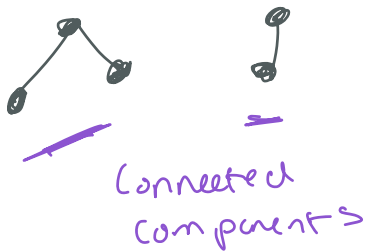
What new can we say about these?



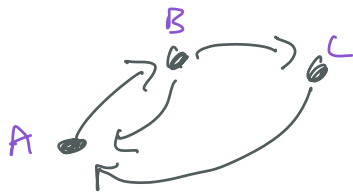
- directed
- not strongly connected
- acyclic
- (DAG)



- weighted
- connected



- unconnected
- each connected component is a tree



- strongly connected
- (u,v) and (v,u) path
- | | | |
|---------|---------|---------|
| (A,B) | (B,A) | (C,A) |
| (A,C) | (C,B) | |

All graphs so far are Simple

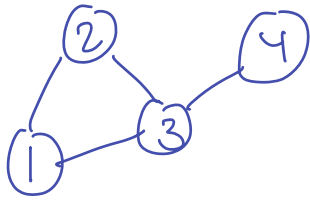


- no self loops
- no multi-edges

Representation

- Adjacency list
- Adjacency matrix

(ex)



Adj List

1: 2, 3

2: 1, 3

3: 1, 2, 4

4: 3

In pseudocode structure:

Func(G)



Function takes G as param

G.Adj[u]



the adj list for vertex u

⋮

for each vertex v in $G.Adj[u]$

↳ explore all of u 's neighbors

Space Complexity

$V = \#$ vertices

$E = \#$ edges

$V + 2 \cdot E$

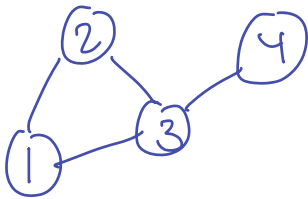
$= \Theta(V + E)$

Linear

→

Pros/Cons of Adj List

- Space complexity \propto
- does (u,v) exist on the graph? \propto $\Theta(E)$



Adj Matrix

	1	2	3	4
1	0	1	1	0
2	1	0	1	0
3	1	1	0	1
4	0	0	1	0

In pseudocode structure

Func (G)

→ Function takes G as param

G.A[u][v]

→ value in adj. matrix for (u,v)

↪ assume

that u, v can be numbers or vertex labels

↪ 0 or 1 if edge from u to v

Space Complexity

$\Theta(V^2)$

matrix is $V \times V$

↪ quadratic

Pros/cons

- space complexity n (unless dense graph)
(unless small)
- is there an edge from (u, v) ? $\ddot{\vdots}$ $G.A[u][v]$
 $\Theta(1)$