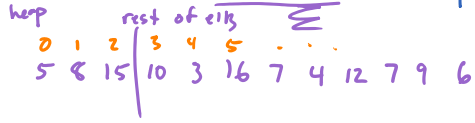


Building a Heap

input: array arr of size n

post: arr is a binary heap

method 1: for $i=1$ to $n-1$ ^{reheap-up}
 add $a[i]$ to the heap in $a[0] \dots a[i-1]$ ^{worst case} $O(n \log n)$



$O(n)$ iterations

method 2: for $i = \text{last non-leaf}$ to 0 \leftarrow INV: nodes at indices $i+1 \dots n-1$ are roots of subtrees that are heaps
 reheap-down starting at i



n times

$$\begin{matrix} 1 + 1 + \dots + 1 \\ \leq \\ n + \dots + n \\ = n^2 \end{matrix}$$

$$\sum_{i=0}^{\lfloor \frac{n}{2} \rfloor - 1} (\log_2 n - \log_2(i+1))$$

$$\leq \sum_{i=0}^{\lfloor \frac{n}{2} \rfloor - 1} \log_2 n$$



iteration in reheap-down
 1st
 2nd
 ...
 $\log_2 n$



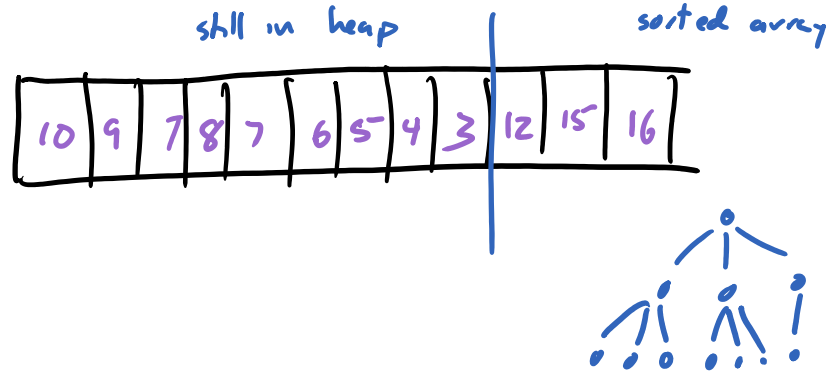
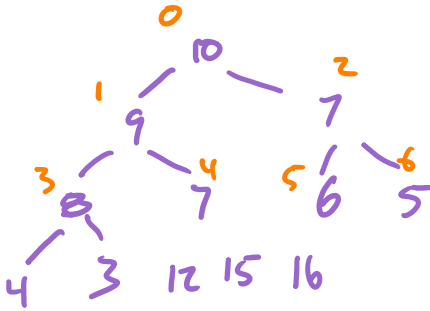
Sum = # iterations of loop in reheap-down for $i = \lfloor \frac{n}{2} \rfloor - 1$

if $n = 2^k$

$$\sum_{i=0}^k n \cdot \left(\frac{1}{2}\right)^k = 2^{k-1} + \dots + 1 = 2^k - 1 = n - 1 = O(n)$$

Heapsort

- 1) build max heap from array $O(\cancel{n \log n}) O(n)$
- 2) extract max repeatedly from array $O(n \log n)$
overall $O(n \log n)$



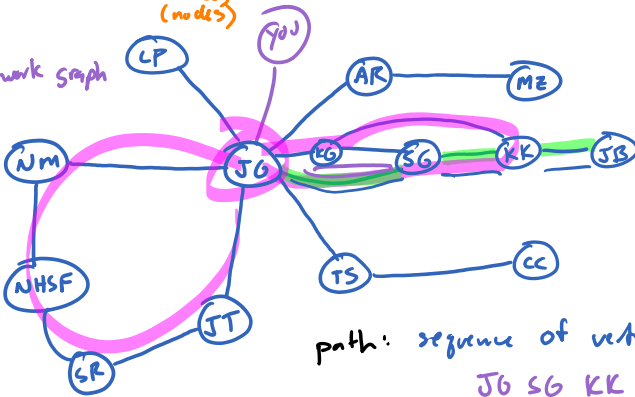
Graphs

↳ representation of things and relationships between them

people
vertices
(nodes)

relationships
edges

Social network graph



path: sequence of vertices s.t. edge exists between adj verts
 JG SG KK JB

simple graph: no self-loops
 at most one edge
 between pair of verts

simple path: no repeated vertices ~~JG SG JG SG KK SG~~

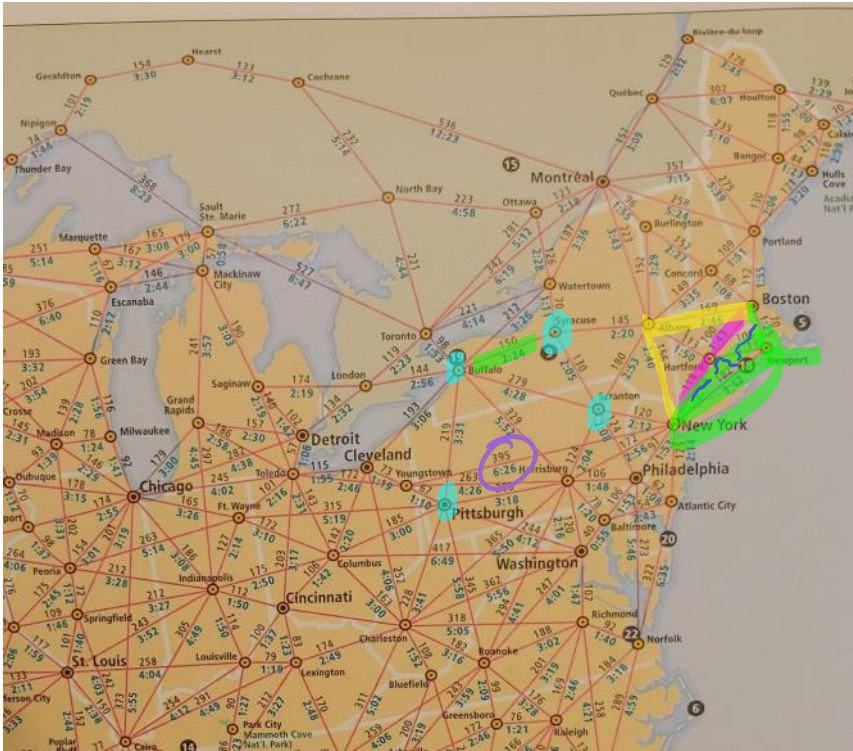
cycle: path starting/ending @ same vertex

JG - SG - KK - KG - JG

simple cycle: only repeat is start/end

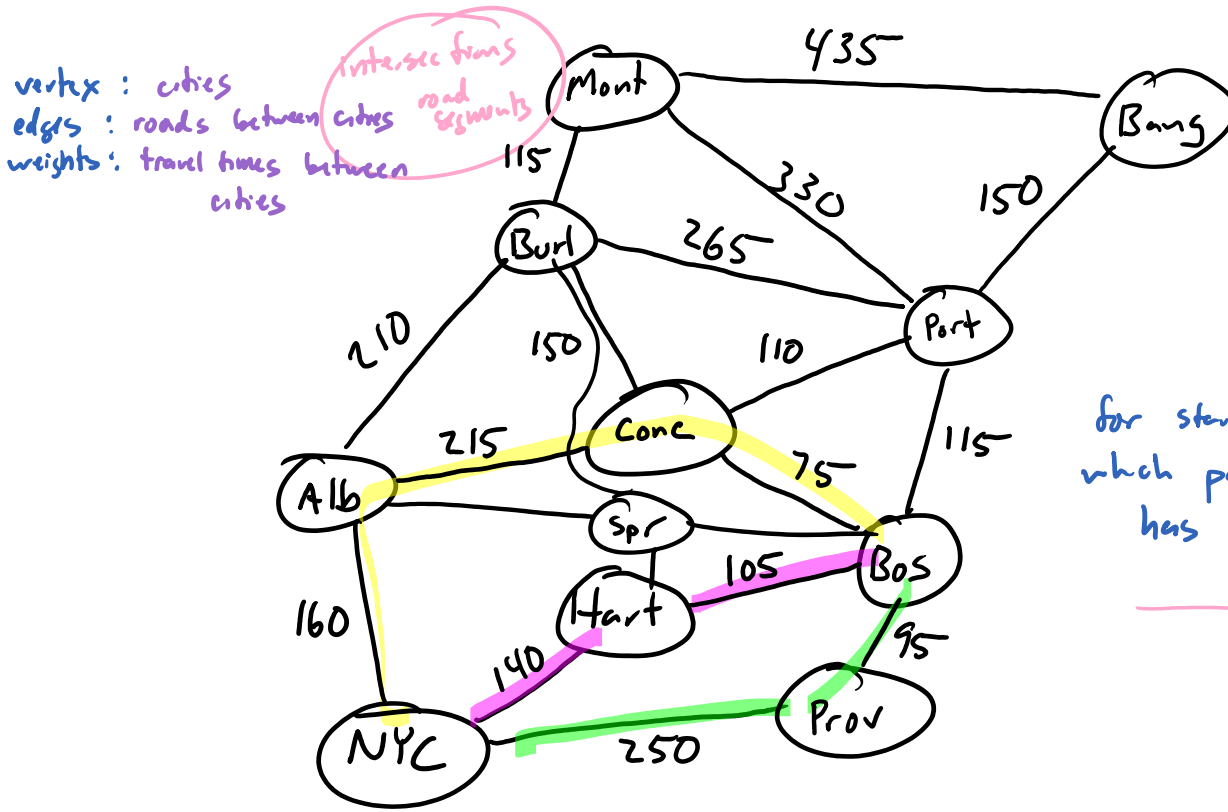
JG - SG - KK - KG - JG - JT - SR - NHSF - NM - JG
 ↳ not simple

Weighted Graph



Source: Rand McNally 2012 Road Atlas

each edge labeled with weight



Flow Control Graph

```

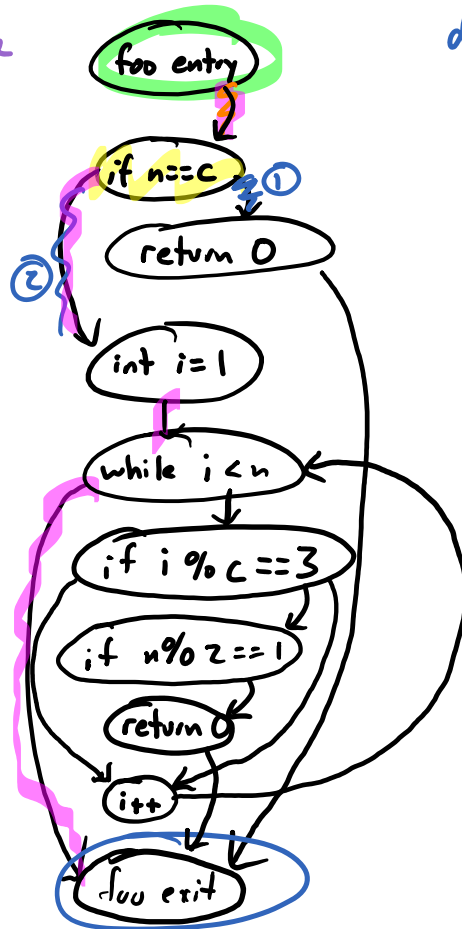
int foo(int n, int c)
{
  if (n == c)
  {
    return 0; ①
  }
  int i = 1; ②
  while (i < n)
  {
    if (i % c == 3)
    {
      if (n % 2 == 1)
      {
        return 0;
      }
    }
    i++;
  }
}
    
```

vertices; lines of code
 edges; control flow



means
 v can immediately follow u in execution

directed graph

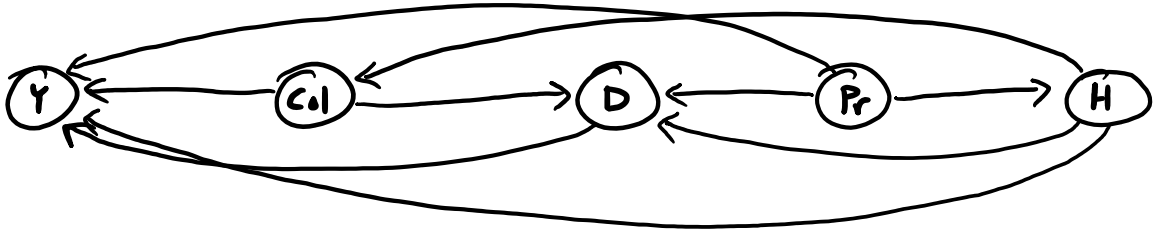


vertices:

edges:

is there path
 entry → exit
 w/no return

Feedback Arc Set



find ordering of vertices that minimizes wrong-way edges

vertices teams Y Col D Pr H

edges $u \rightarrow v$ means v beat u in a game

Feedback Arc Set: what is min num edges you need to remove to make graph acyclic (no cycles)

is there a cycle?

if not, find ordering so all edges go in same dir

if so, find ordering to minimize # of wrong-way edges

brute force: for each ordering
count # of wrong-way edges
keep track of ordering giving min-so-far