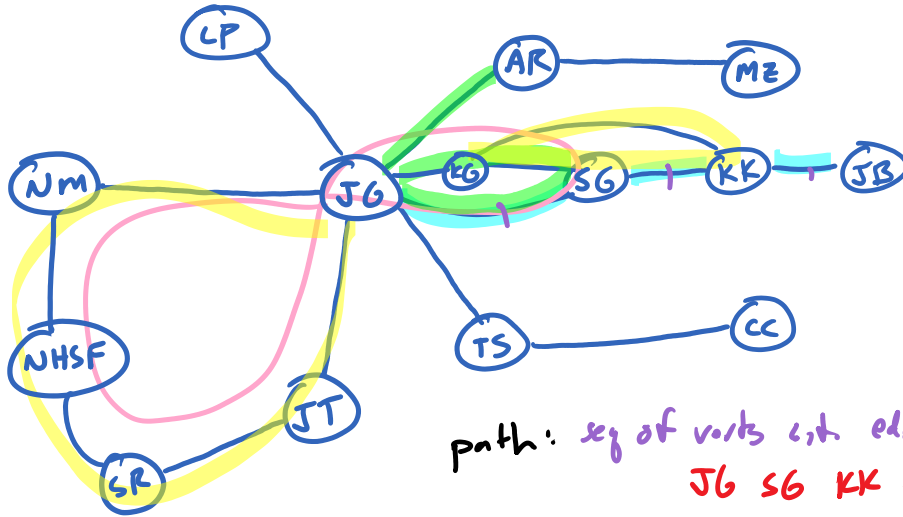


Graphs

↳ representation of things and relationships between them  
 vertices → people  
 edges → relationships

undirected



path: seq of vorts with edge exists between adj vorts  
 JG SG KK JB

simple graph: no self-loops  
 at most one edge  
 per pair of vorts  
 (per direction if  
 a directed graph)

simple path: no repeated vertices <sup>not simple</sup>  
 JG SG JG SG KK JB

cycle: path w/ same start/end  
 JG SG KK JG

simple cycle: only repeat is start/end

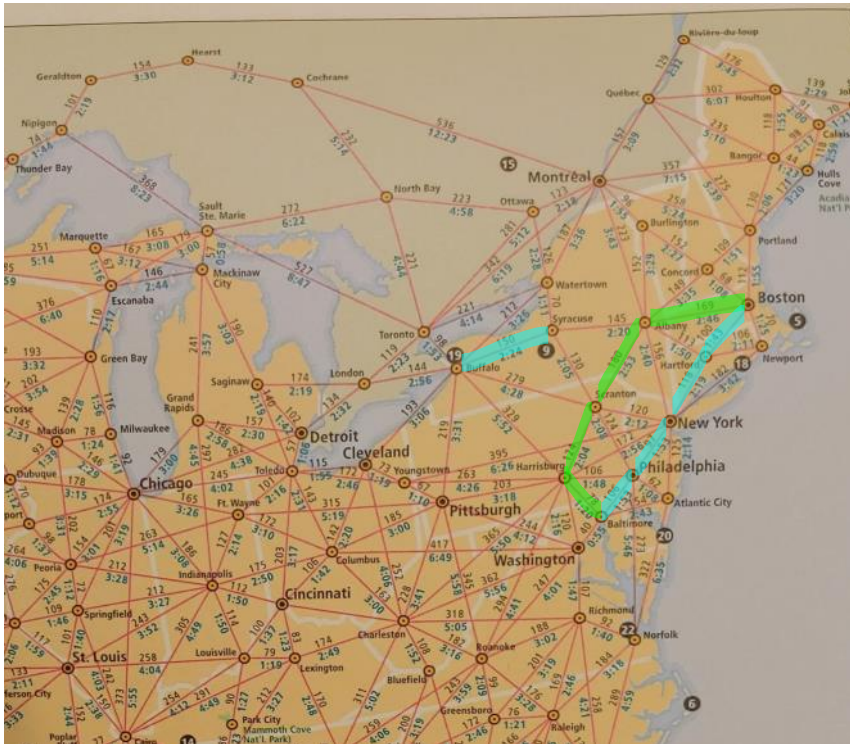
path:

simple path:

cycle:

simple cycle:

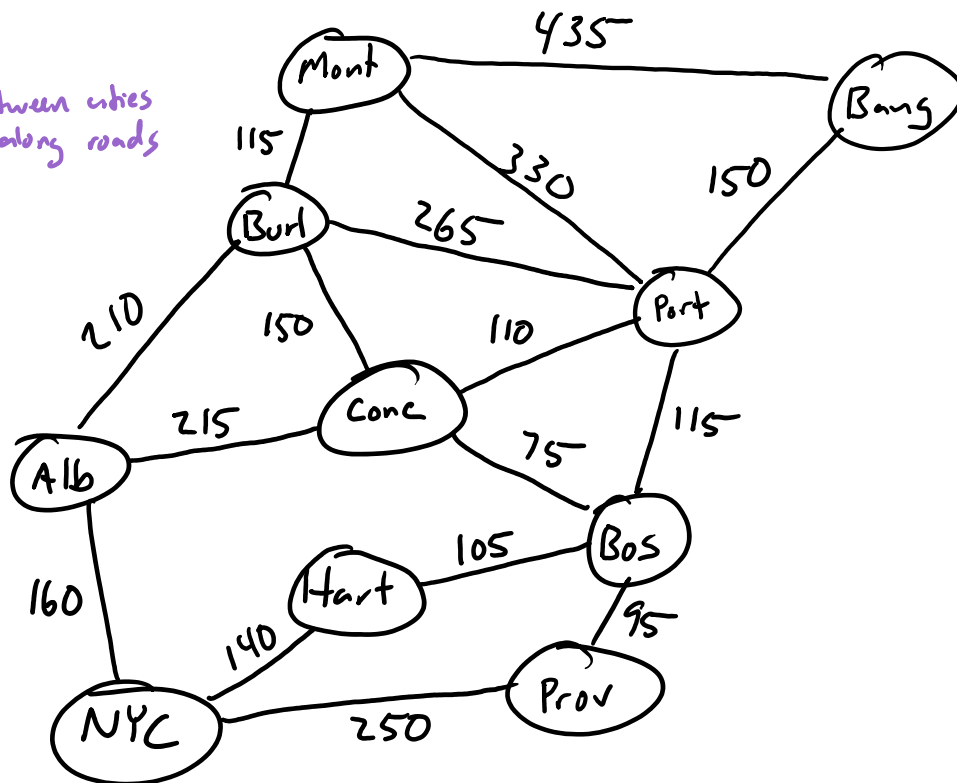
# Weighted Graph

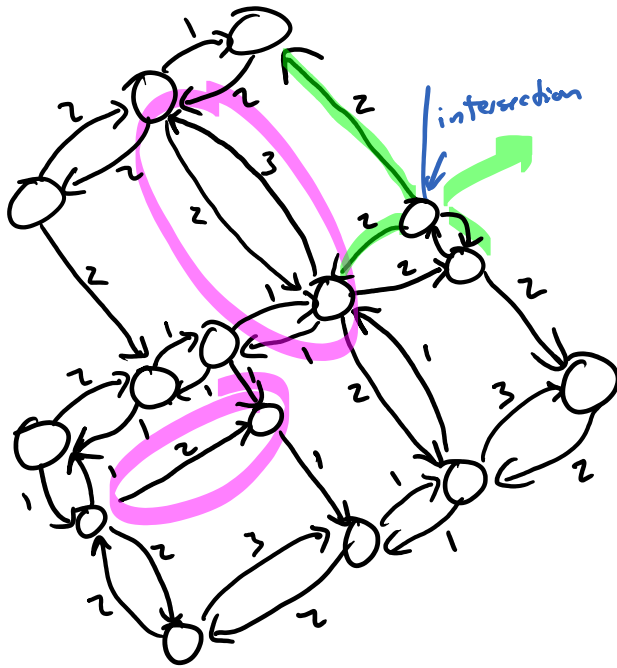


Source: Rand McNally 2012 Road Atlas

each edge detailed with weight

vertex : cities  
 edges : roads between cities  
 weights : distance along roads



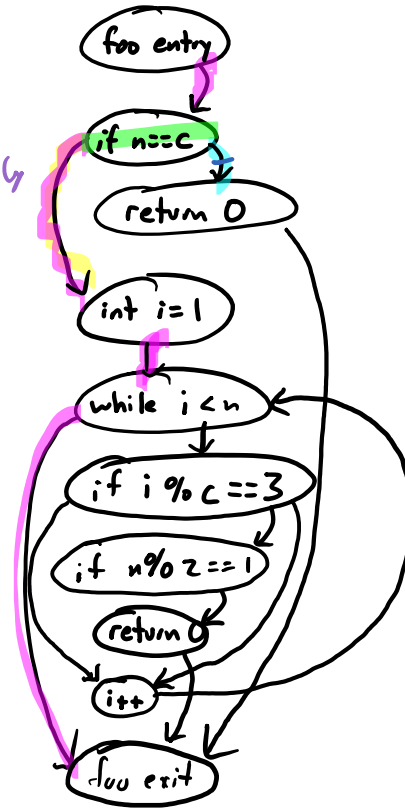


# Flow Control Graph

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

vertices: lines of code  
edges: control flow

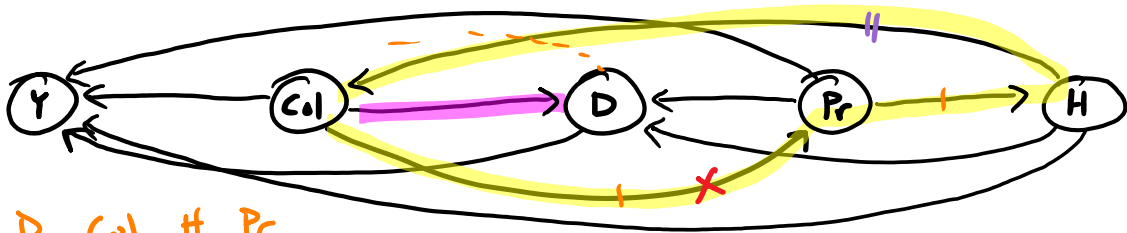
u → v  
if v might immediately follow u in some execution



while (x != 0) { x++; }

is there a path entry → exit w/ no return statement?

Feedback Arc Set



Y D Col H Pr  
 ←

H > Pr > Col

vertices teams

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)

NP-complete  
 (like TSP)

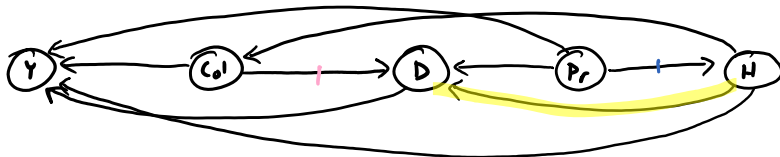
brute force: for each possible ordering <sup>n!</sup>  
 count wrong-way edges  
 keep track of min wrong-way

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

# Graph Representation



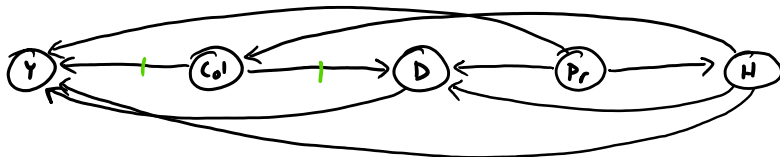
## Adjacency Matrix

from \ to	Y	Col	D	Pr	H
Y	F	F	F	F	F
Col	T	F	T	F	F
D	T	F	F	F	F
Pr	T	F	T	F	T
H	T	T	T	F	F

keys	values
Y	0
Col	1
D	2
Pr	3
H	4

space:  $\Theta(n^2)$

unweighted - entries are T/F  
 weight - entries are weights or "not there"



## Adjacency List

(array of lists - one for each vert w/verts at to end of edge on list)

0	Y	:	
1	Col	:	Y <sup>0</sup> D <sup>2</sup>
2	D	:	Y <sup>0</sup>
3	Pr	:	Y <sup>0</sup> D <sup>2</sup> H <sup>4</sup>
4	H	:	Col <sup>1</sup> D <sup>2</sup> Y <sup>0</sup>

n: vertices m: edges

space: worst case  $\Theta(n^2)$   
 best case  $\Theta(n)$   
 $\Theta(n+m)$

Adj Set: use hash table for set representation

has-edge (from, to)

adj matrix: array lookup  $O(1)$

adj list: seq. search  $O(n)$

add-edge (from, to)

precond: edge doesn't exist

adj matrix: array store  $O(1)$

adj list: add to list  $O(1)$  amortized

## for each edge

adj matrix:

for each row r  
 for each col c  
 if  $adj[r][c] == T$   
 process-edge(r, c)

adj list:

for each vertex u  $\Theta(n)$   
 for each v in  $adj[u]$   $\Theta(\text{outdegree}(u))$   
 process-edge(u, v)

worst case  $\Theta(n^2)$

$$\sum_{i=0}^{n-1} (1 + \text{outdegree}(v_i))$$

$\Theta(n+m)$

$\Theta(n)$  for sparse

$\Theta(n^2)$  for dense

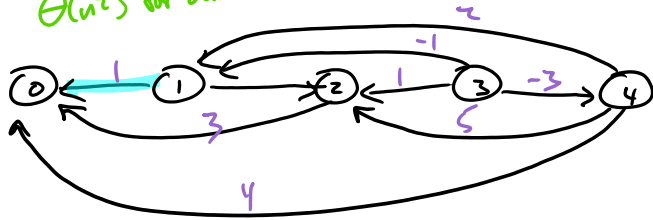
for each  $v$  in  $\text{adj}[u]$   $\Theta(\text{outdegree}(u))$   
process-edges( $u, v$ )  
weight  $w$   
dest vertex

- 0:  $\downarrow$
- 1:  $\{0, 1\}$
- 2:  $\uparrow$
- 3: weight
- 4:

$$\sum_{i=0}^{n-1} (1 + \text{outdegree}(v_i))$$

$$= \sum_{i=0}^{n-1} 1 + \sum_{i=0}^{n-1} \text{outdegree}(v_i)$$

$$= n + m$$



sparse:  $m \in \Theta(n)$   
dense:  $m \in \Theta(n^2)$

Graph Implementation Time/Space Complexity

	Adj Matrix	Adj List	Adj Set (Hash)
Space	$\Theta(n^2)$	$\Theta(n+m)$	$\Theta(n+m)$
has_edge( <u>from</u> , to)	$O(1)$	$O(n)$	$O(1)$ expected
add_edge	$O(1)$	$O(1)$	$O(1)$ expected
for_each_out_neighbor	$O(n)$	$O(n)$ worst	$O(n)$ worst
for each edge for each vertex for each_out_neighbor	$\Theta(n^2)$	$\Theta(n+m)$	$\Theta(n+m)$