

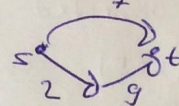
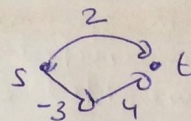
how to handle  
negative edges

idea: add smallest

- weight to all

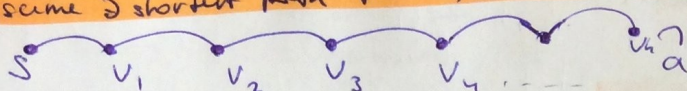
→ wrong

- priority queue  
update won't work



## Bellman - Ford

assume  $\exists$  shortest path from  $s, v_1, v_2, \dots, v_k, \dots, a$



property: if  $s \rightarrow a$  is shortest path,

then each subpath is shortest

→ inductively find shortest path

SP2 <sup>1st time</sup> loop <sup>2nd time</sup> loop

for  $v \in V$  do

dist[v] :=  $\infty$

prev[v] := nil

dist[s] := 0

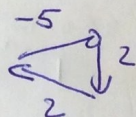
for  $i = 1 \dots n-1$

$O(V)$

for  $(v, w) \in E$  update  $(v, w)$

$O(E \cdot V)$

Are with negative weights, <sup>negative</sup>  
but does not allow for cycles



→ there is no  
finite # of  
steps because  
there is no shortest path

how to deal with negative  
cycles?

run through  $E$  one extra time

~~no~~ no neg. cycles  $\Leftrightarrow$  nothing changes in the loop

also once nothing changes, it cannot change in the  
next round

→ ~~stop~~ stop early



## Graph Algs

### Minimum spanning trees

\* undirected graph  
weighted edges

**Tree**: connected and acyclic

Lemma (LFR): any 2 of these  $\Rightarrow$  3rd

- 1)  $G$  is connected
- 2)  $G$  is acyclic
- 3)  $|E| = |V| - 1$

**Spanning tree, given  $G$ :**

$T \subseteq E$  on all of  $V$  (vertices of  $G$ )

**Min spanning tree:**

spanning tree minimizing  $\sum_{e \in T} w(e) = w(T)$

Bruteforce alg:

for each spanning tree calculate its weight,  
keep the minimum

<del>size</del> $n$	# spanning trees	
2	1	
3	3	
4	16	
5	125	
$n$	$n^{n-2}$	

superexponential growth  
of the problem size

MST - an edge at a time

**Cut property:**

let  $X \subseteq T$ , where  $T$  is an MST of  $G$

let  $S \subseteq V$ , such that no edge in  $X$  crosses from  $S$  to  $V-S$

let  $e$  be a min weight edge from  $S$  to  $V-S$

then  $X \cup \{e\} \subseteq T'$  for some MST  $T'$

$\rightarrow$  can construct MST in a greedy fashion



## Proof by contradiction

assume  $e \notin T$

adding  $e$  creates a cycle

from  $S \rightarrow V-S \rightarrow S$ , since

$\exists e' \in T$ , going from  $S \rightarrow V-S$

let  $T' = T \cup \{e\} - \{e'\}$

$T'$  is a spanning tree, since  
the cycle eliminated

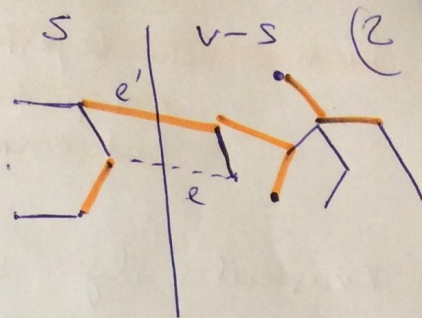
$w(e) \leq w(e')$

$w(T') \leq w(T)$

if  $w(e) < w(e')$  contradiction  $\Rightarrow e \in T$

if  $w(e) = w(e')$ , then  $T'$  is another MST

$e$  is in  
an MST



— not yet added  
— added

$|E| = |V| - 1 \Rightarrow$  connected  
and acyclic  $\Rightarrow$  spanning tree

## General algorithm form

$X = \emptyset$

Repeat until  $|X| = n - 1$

cut  $\rightarrow$  pick  $S \subseteq V$  w/ no edge in  $X$  crossing  $S, V-S$

explicit  $\rightarrow$  get lightest edge  $e$  between  $S$  and  $V-S$

$X = X \cup \{e\}$

One way: force  $X$  at each step to be a connected subtree

Prom's

$H := \{S: 0\}$

for  $v \in V$

$\text{dist}[v] := \infty, \text{prev}[v] := \text{nil}$

$\text{dist}[S] := 0$

while  $H \neq \emptyset$

$v := \text{deletemin}(H)$

$S := S \cup \{v\}$

for  $(v, w) \in E$  and  $v \in V-S$  do

if  $\text{dist}[w] > \text{length}(v, w)$

$\text{dist}[w] := \text{dist}[v] + \text{length}(v, w)$

$\text{prev}[w] := v$

insert  $(w, \text{dist}[w], H)$

$\rightarrow$  Prom's alg.

use priority queue  
(e.g., heap)

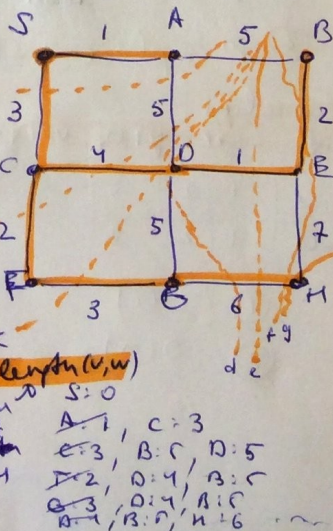
$O(E \text{ insert} + V \text{ delete})$

heap  $O(E \log V)$

cost  $O(V^2)$

go through  
 $E$  once

like Dijkstra  
but without  
adding  
to previous  
sum





Prim: like Dijkstra, distance notion is different  
 not path length (sum of previous edges)  
 but connection length to the subtree

Kruskal's alg: second way

sort edges

in increasing order of edges

if the edge does not add a cycle

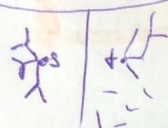
add it

} implicit cut

Proof

Since it does not create a cycle  
 if it crosses a cut

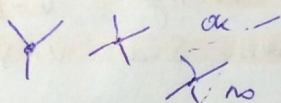
no cycle  $\Rightarrow$  not a cut  
 $|V|-1 > |E|$  G



and  
 of  $V$  a smallest edge  
 to cross this cut

$\Rightarrow$  cut property satisfied

checking if no cycle:



disjoint set data structures

sets: components of vertices

①  $\rightarrow$  are 2 sets in the same set

②  $\rightarrow$  replace 2 sets by their union

baseline  
 with arrays of vertices:

v	1	2	3	...	n
set	1	2	2		3

①  $O(1)$

②  $O(n)$   $\leftarrow$  bad for Kruskal

