

# Announcements

Hw1 solutions posted on Canvas

Hw2 is available on Gradescope (one coding question and 2 written question) **Due Friday Feb 6 only one late day.**

Sections **attendance mandatory, will include a 10 min quiz** about previous hw.

**Prelim 1:** Thursday, Feb 12. fill out this [form](#), if you have a conflict.

Covers hw1-2, sections week 1-2, lectures through this week. Section next week is review. *this week dynamic programming practice*

Other prelim info and practice questions will be posted shortly

## Min-cost path: recall Dijkstra (sec 4.4)

costs are  $\geq 0$

also in CS 2110/12

graph  $(V, E)$  cost  $c_{vw}$  for  $(v, w) \in E$

Problem find min-cost  $s \rightarrow t$  path



similar to Prim

select min cost out of  $s$

$(s, v)$  = min cost path to  $v$

compute  $dist(s \rightarrow v)$  all other  $v \in V$

Dijkstra

$dist(s) = 0$

$S = \{s\}$   
nodes reached

while  $t \notin S$

select  $w \notin S$  min

min  $dist(u) + c_{uw}$

set  $dist(w) = dist(u) + c_{uw}$

add  $w$  to  $S$

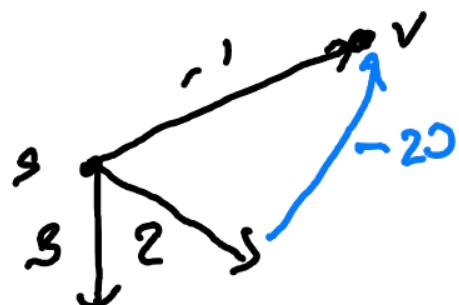
endwhile

## Min cost path with negative costs (sec 6.8)

assume no negative cycles

Does Dijkstra work OK?

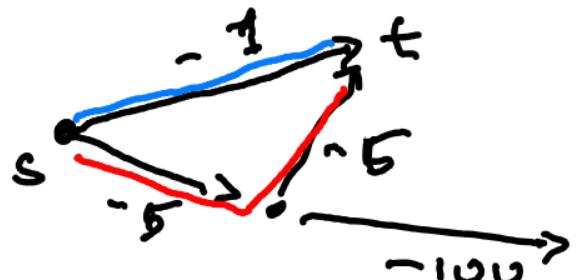
①



not working

②

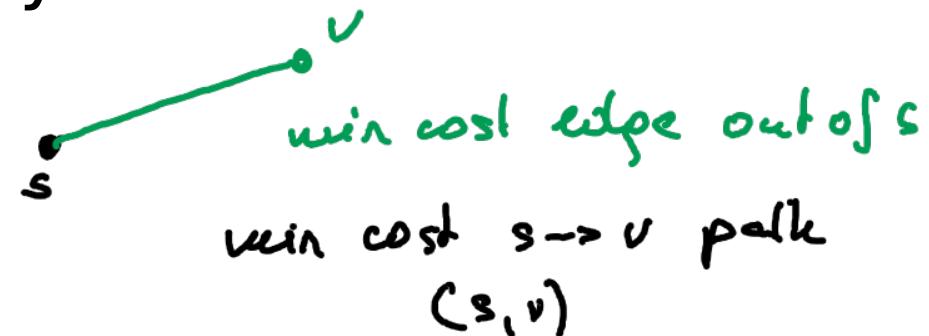
natural idea: add  $M$  to all costs; run Dijkstra  $c_{vw} + M$



run cost  $(s, t)$  cost - 1

with  $c_{vw} + M$  red wins

We will compute run cost  $s \rightarrow v$  for all nodes  $v$



# Dynamic Programming III: Min-cost path

assume no negative cycles promise

Subproblems?

version 1: min cost using only nodes  $\{1, \dots, i\}$  in path

version 2: min cost using  $\leq i$  edges

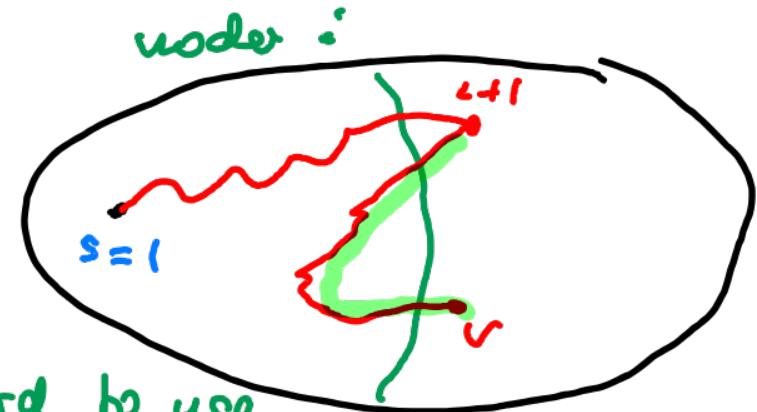
today by version 2.

base  $i=0 \text{ or } 1$

$$\text{Opt}(i, v) = \begin{cases} c_{s,v} & (s, v) \in E \text{ & } v \neq s \\ +\infty & (s, v) \notin E \text{ & } v \neq s \\ 0 & v = s \end{cases}$$

due to promise of no neg. cycles

this is hard to use



$\text{Opt}(i, v) = \text{min cost of } s \rightarrow v \text{ path}$   
using  $\leq i$  edges



# Bellman-Ford algorithm

The dynamic program

$$Opt(0, v) = \begin{cases} +\infty & v \neq s \\ 0 & v = s \end{cases}$$

For  $i = 1, 2, \dots, |V|-1$

For all  $v \in V$

$$Opt(i, v) = \min_{\substack{\text{using } \leq i \\ \text{edges}}} (Opt(i-1, v),$$

$Opt(i, v) = \min \text{ cost path } s \rightarrow v$   
using  $\leq i$  edges

$Opt(i-1, v)$  computed



$$\min_{\substack{w, (w, v) \in E \\ \text{using } \leq i \\ \text{edges}}} (Opt(i-1, w) + c_{wv})$$

end for

end for

return  $Opt(|V|-1, +)$

How many edges can be in a path  $s \rightarrow t$

$$\leq |V|-1$$



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What is the running time of the Bellman-Ford Algorithm on a graph with  $n$  nodes and  $m$  edges?

- A.  $O(n + m)$
- B.  $O(n^2)$
- ✓ C.  $O(nm)$

$$\text{Opt}(0, v) = \begin{cases} 0 & v = s \\ \infty & \text{else} \end{cases}$$

- For  $i = 1 \dots, n-1$

- For  $v \in V$

- \*  $\text{Opt}(i, v) = \min (\text{Opt}(i-1, v), \min_{w: (v, w) \in E} \text{Opt}(i-1, w) + c_{vw})$

inner loop  $\sum_v O(\deg(v)) = O(m)$



updating old  $\text{deg}(v)$

- D.  $O(m^2)$
- ✓ E.  $O(n^3)$

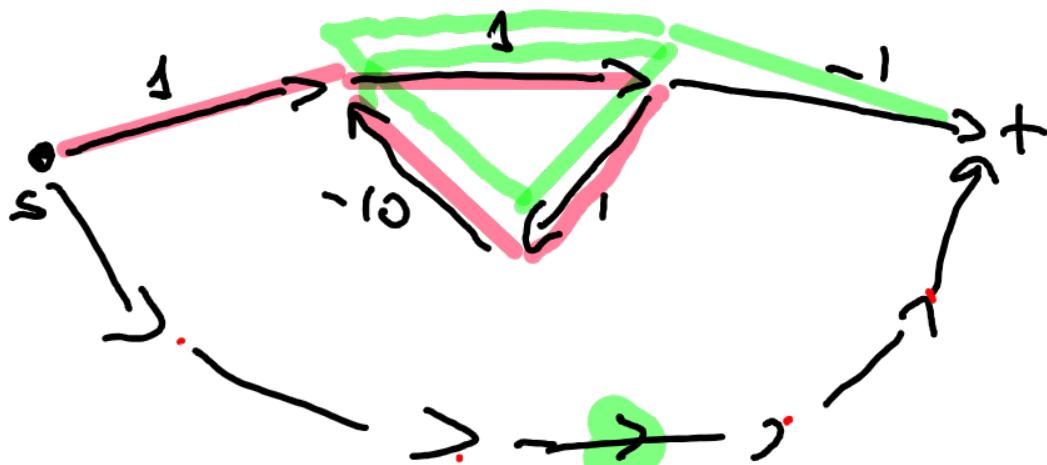
- F. Slower than any of these bounds

• outside for loop  $i$   
• inside for loop  $v$   
computing Opt  
max  $u-1$  if  
 $v$  has many  
incoming edges



# What happens if G has negative cycle?

see section this week: must but verify



Alg finds

path using  $\leq 8$  edges

no min cost =  $-\infty$

Note: min cost **simple** path  
= no repeat nodes  
computationally hard