

# Algorithms - Spring '25

Shortest  
Paths



# Recap

- HW due today
- Next: over MST + SSSPs
- No reading Monday
- Resume next Wed w/ readings

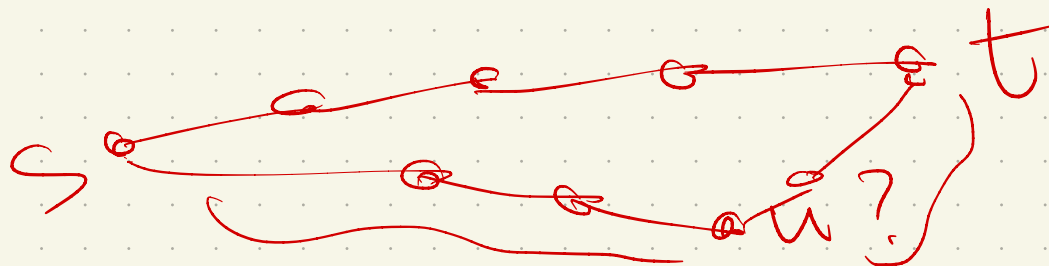
Next: Shortest paths

Goal: given  $s, t \in V$ , compute the shortest path from  $s$  to  $t$ .

Motivation: roads  
routing  
cost

To solve this, we need to solve a more general problem:  
find shortest paths from  $s$  to every vertex.

Why?



# Computing a SSSP.

(Ford 1956 + Dantzig 1957)

Each vertex will store 2 values.

(Think of these as tentative shortest paths.)

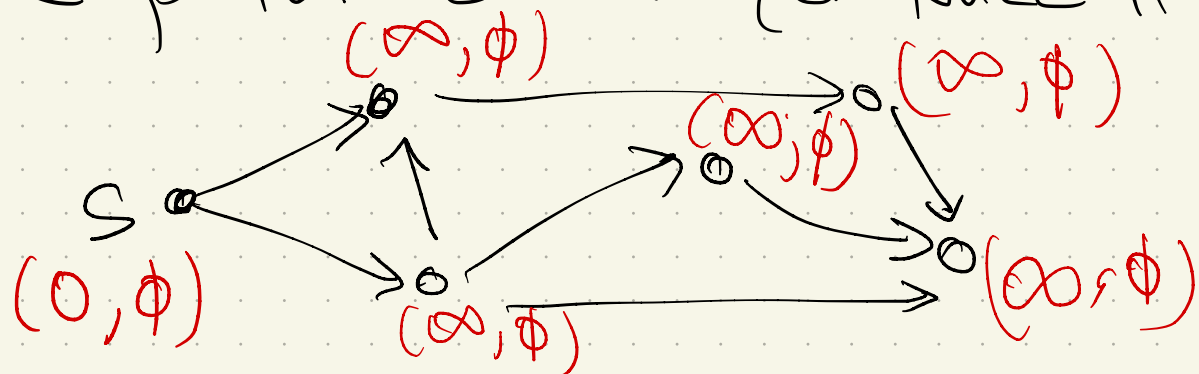
(dist, pred)

-  $\text{dist}(v)$  is length of tentative shortest path  $s \rightsquigarrow v$

(or  $\infty$  if don't have an option yet)

-  $\text{pred}(v)$  is the predecessor of  $v$  on that tentative path  $s \rightsquigarrow v$  (or NULL if none)

Initially:

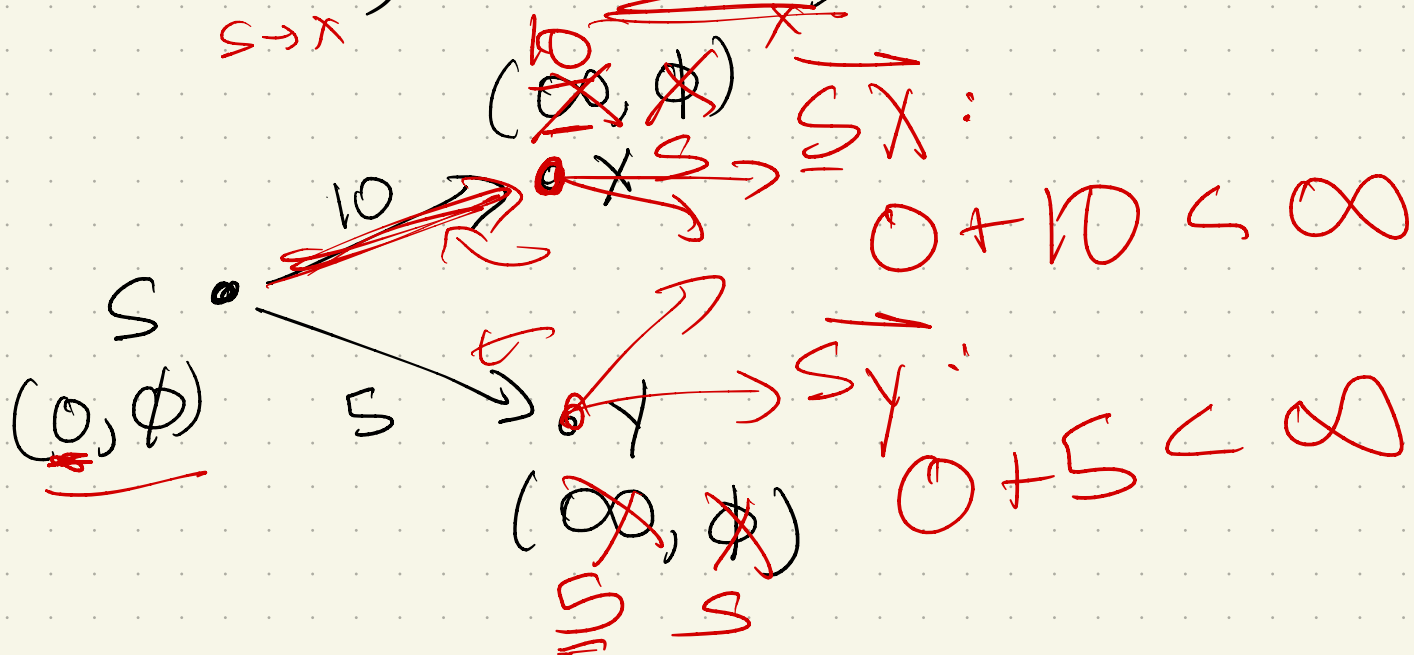




We say an edge  $\vec{uv}$  is tense if

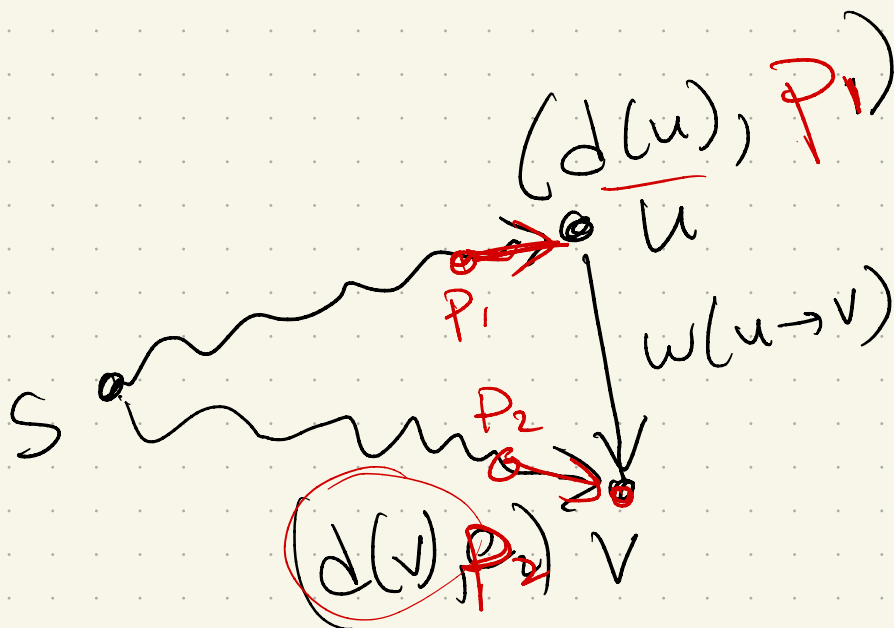
$$\text{dist}(u) + w(u \rightarrow v) < \text{dist}(v)$$

Initially:



Here:

In general:



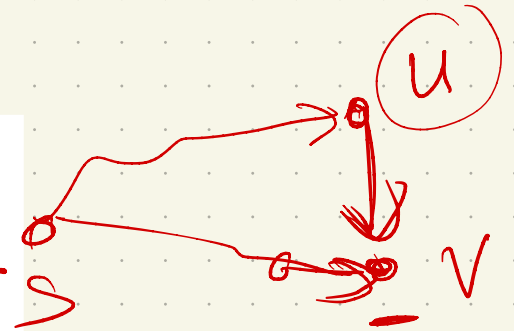
Key idea for algorithm:

Find tense edges & relax them:

RELAX( $u \rightarrow v$ ):

$dist(v) \leftarrow dist(u) + w(u \rightarrow v)$

$pred(v) \leftarrow u$



Then:

INITSSSP( $s$ ):

$dist(s) \leftarrow 0$

$pred(s) \leftarrow \text{NULL}$

for all vertices  $v \neq s$

$dist(v) \leftarrow \infty$

$pred(v) \leftarrow \text{NULL}$

GENERICSSSP( $s$ ):

INITSSSP( $s$ )

put  $s$  in the bag

while the bag is not empty

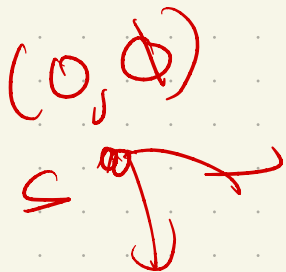
take  $u$  from the bag

for all edges  $u \rightarrow v$

if  $u \rightarrow v$  is tense

RELAX( $u \rightarrow v$ )

put  $v$  in the bag



Claim: At any point in time,  $\text{dist}(v)$  is either  $\infty$  or the length of some  $s \rightarrow v$  walk.

Proof: Induction on while loop iterations.

Base case: loop iteration 1

at beginning,  $s$  has  $\text{dist} = 0$  +

all others =  $\infty$

at end,  $s$  has  $\text{dist} = 0$  still,

+ all neighbors  $u$  now have

$\text{dist}(u) = w(s \rightarrow u)$ , which is a length 1 walk. (Others are  $\infty$ )

Ind hyp:

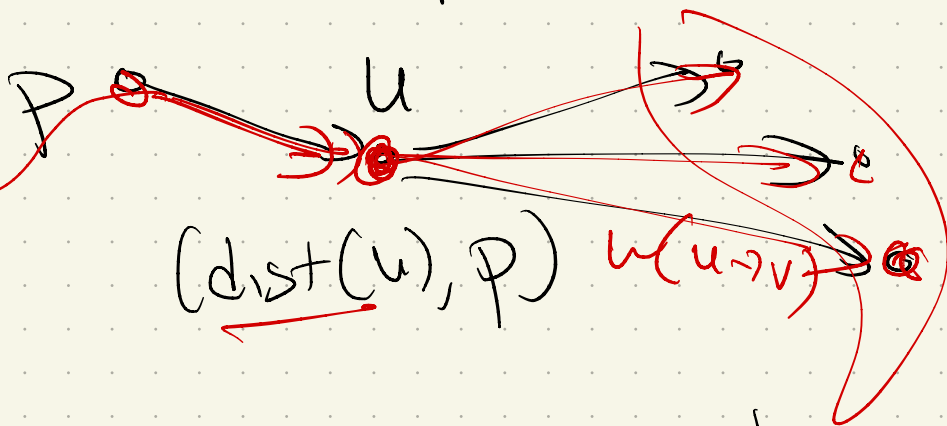
In iteration  $k-1$ , the claim is

true

(all vertices  $v$  have  $\text{dist}(v) = \infty$   
or  $=$  length of an  $s \rightsquigarrow v$  walk)

Ind Step:

In iteration  $k$ : At beginning, we  
take out some vertex  $u$ .



By IH,  $\text{dist}(u)$   
is the weight  
of some  $s \rightsquigarrow u$  walk.

At end, all nbrs  $v$  of  $u$  are either  
unchanged (& so by IH are still  
either  $\infty$  or length of  $s \rightsquigarrow v$  walk)

or  $u \rightarrow v$  was tense,  $\rightarrow$

$$\text{now } \text{dist}(v) = \text{dist}(u) + w(u \rightarrow v).$$

Since  $\text{dist}(u)$  is a  $s \rightsquigarrow u$  walk,

then  $\text{dist}(v)$  is weight of the

walk  $(s \rightsquigarrow u) + (u \rightarrow v)$ , which

is a walk with one more edge

at end.

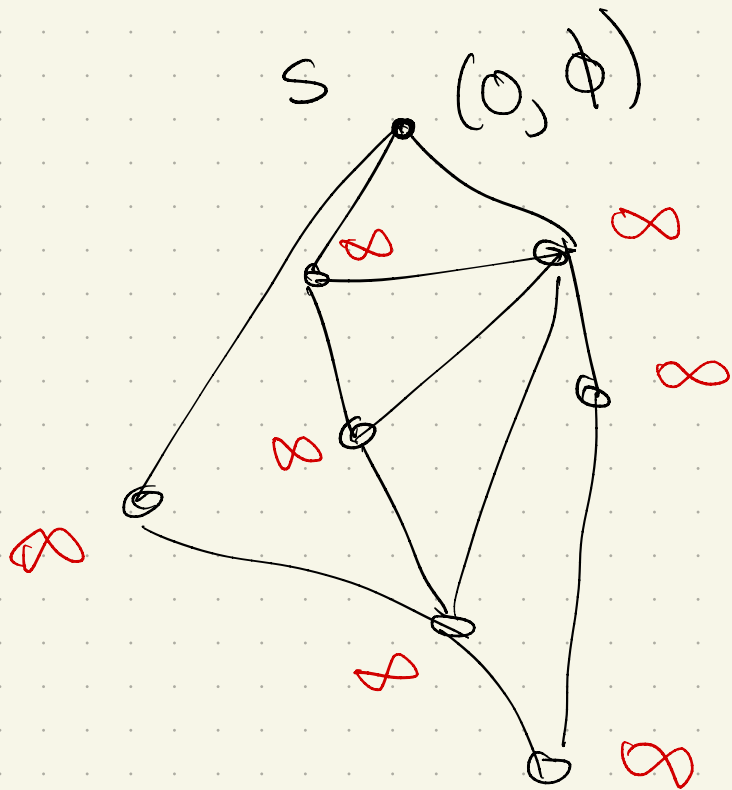
(All other vertices are unchanged,  
so by IH are still  $\infty$  or a  $s \rightsquigarrow v$   
walk.)  $\square$

# Warm-up: Unweighted graphs

→ use a queue

How does "fense" work?

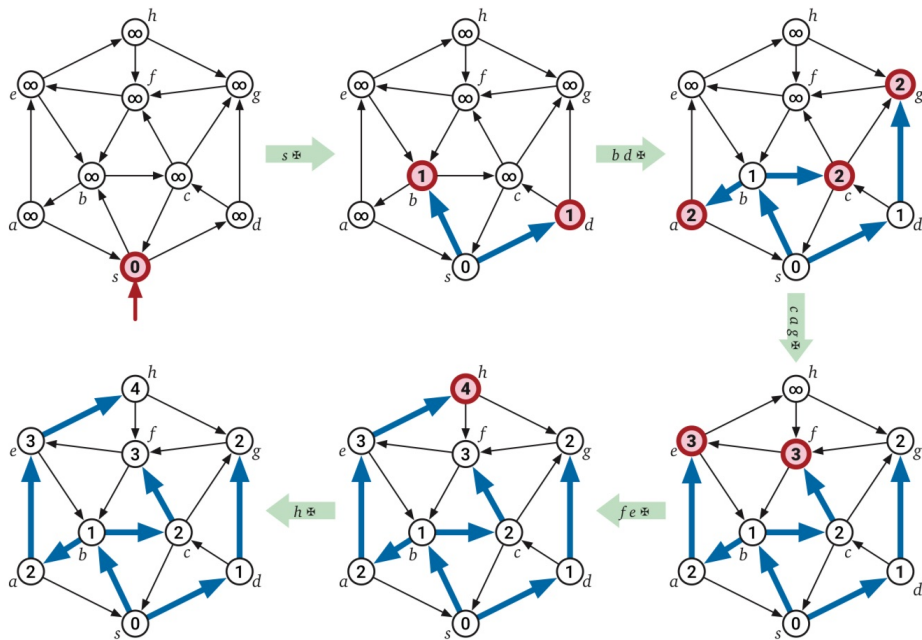
(Hint: think BFS!)



all nbrs of  $s$   
have fense incoming  
edges:

$$d(s) + w(s \rightarrow u) \\ = 0 + 1 < \infty$$

# What the heck is his token??



**Figure 8.6.** A complete run of breadth-first search in a directed graph. Vertices are pulled from the queue in the order  $s \ast b d \ast c a g \ast f e \ast h \ast \ast$ , where  $\ast$  is the end-of-phase token. Bold vertices are in the queue at the end of each phase. Bold edges describe the evolving shortest path tree.

queue: ~~s~~ ~~b~~ ~~d~~ ~~c~~ ~~a~~ ~~g~~ ~~f~~ ~~e~~ ~~h~~

$u =$  ~~s~~ ~~b~~ ~~d~~ ~~c~~ ~~a~~ ~~g~~ ~~f~~ ~~e~~ ~~h~~

**BFSWITHTOKEN(s):**

INITSSSP(s)

PUSH(s)

**PUSH( $\ast$ )**  $\leftarrow$  *start the first phase*

while the queue contains at least one vertex

$u \leftarrow$  PULL()

if  $u = \ast$

**PUSH( $\ast$ )** *start the next phase*

else

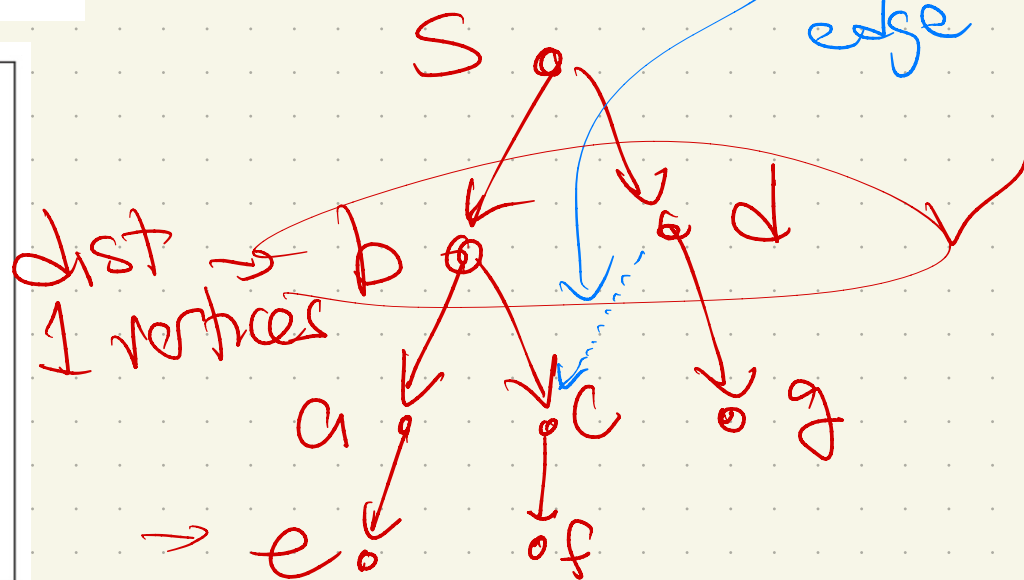
for all edges  $u \rightarrow v$

if  $dist(v) > dist(u) + 1$  *if  $u \rightarrow v$  is tense*

$dist(v) \leftarrow dist(u) + 1$

$pred(v) \leftarrow u$  *relax  $u \rightarrow v$*

PUSH(v)

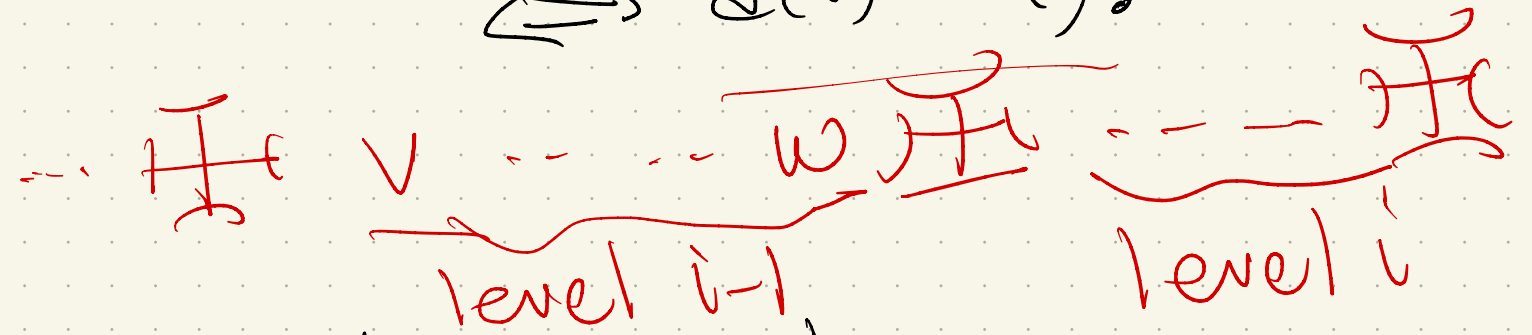


# Lemma

At the end of the  $i$ th phase (when  $\mathbb{H}$  comes off the queue), for every vertex  $v$ ,

either  $\bullet d(v) = \infty$   
(not found yet)

or  $\bullet d(v) \leq i$   
(and  $v$  is only in queue  $\iff d(v) = i$ ).



proof: induction on phase

Base case: phase 0:  $s$ 's nbrs

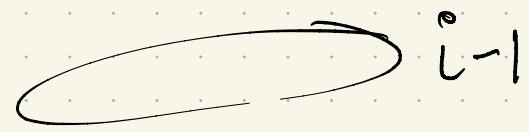
~~$d(s) = 0$~~   $d(s) = 0$   $d(s$ 's nbrs) = all = 1



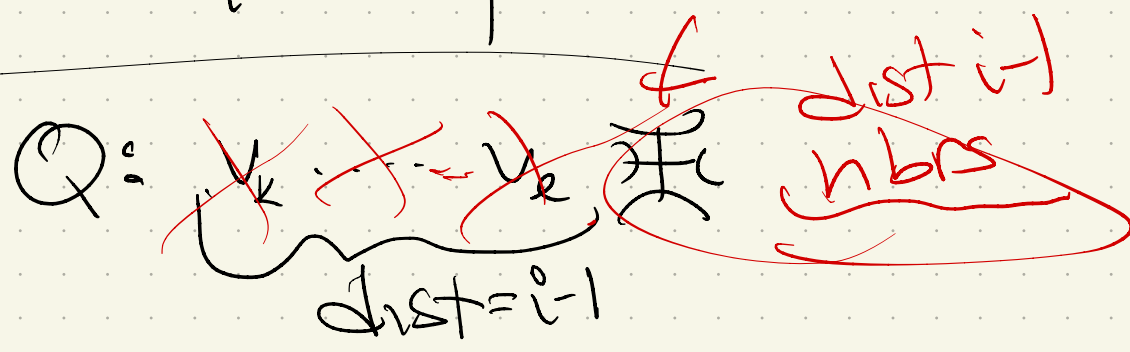
Inductive Hyp: Lemma holds  
for phases  $\leq i-1$

IS: phase  $i$ : We know by the  
IH, when last phase ended:

BFS tree



What now?



In this phase, any  
undiscovered nbr of level  
 $i-1$  vertex will go at  
end of queue

## 2<sup>nd</sup> version: DAGs

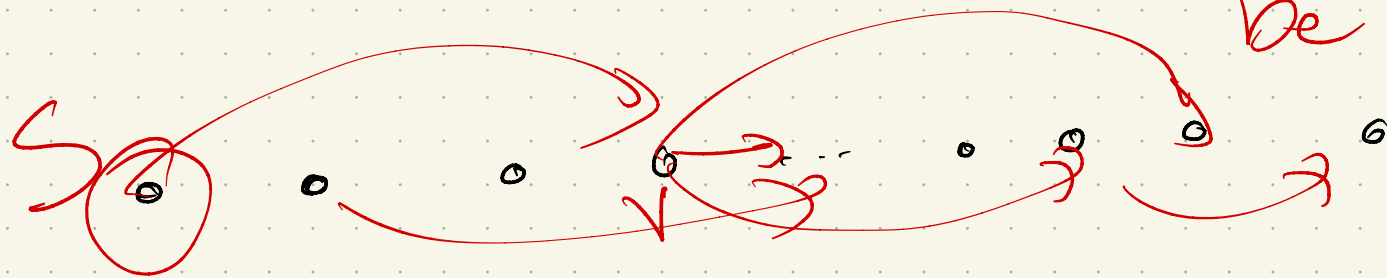
What if directed & acyclic?

Remember! helps to have all "closer" vertices done before computing your distance.

Well, know something about DAG-orders:

↳ topological order!

only vertices which can be in SP to



V will be before

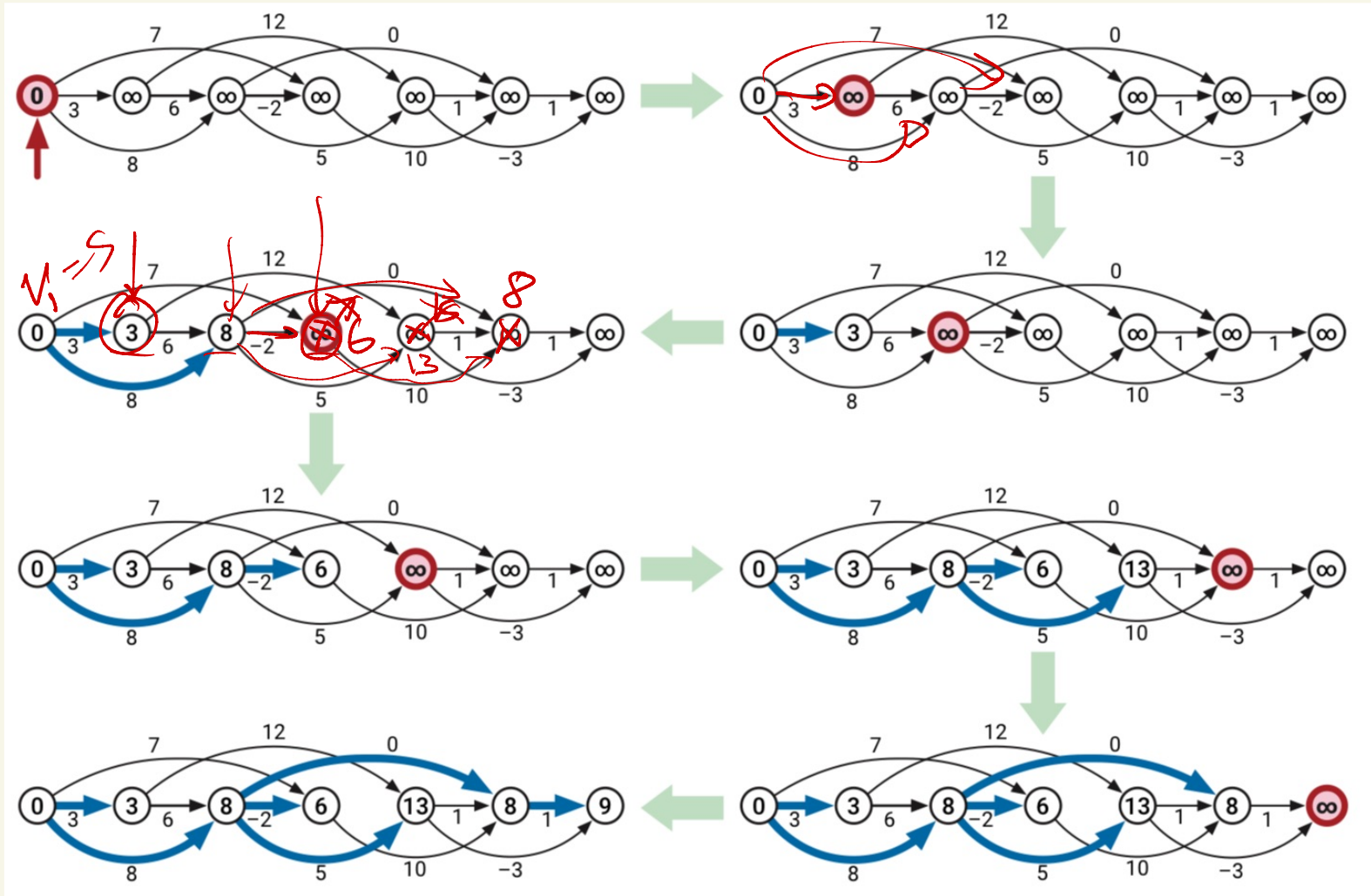
edges: later in ordering V

So, use it!

$O(V+E)$   
 $\sum_v (1+d(v))$   
 $V = V + 2E$

DAGSSSP(s):  
 INITSSSP(s)  
 for all vertices  $v$  in topological order  
 for all edges  $u \rightarrow v$   
 if  $u \rightarrow v$  is tense  
 RELAX( $u \rightarrow v$ )

$s$  has dist = 0  
 all others  $\infty$



Dijkstra (59)  $\rightarrow$  assume pos edges

(actually Leyzorek et al '57, Panteig '58)

Make the bag a priority queue:

Keep "explored" part of the graph,  $S$

Initially,  $S = \{s\} + \text{dist}(s) = 0$

(all others NULL  $\rightarrow \infty$ )

While  $S \neq V$ :

select node  $v \notin S$  with one edge from  $S$  to  $v$  with:

$\min_{e=(u,v), u \in S} (\text{dist}(u) + \omega(u \rightarrow v))$  } *item on!*

Add  $v$  to  $S$ , set  $\text{dist}(v)$  +  $\text{pred}(v)$

Let's formalize this a bit...

# Correctness (w/ pos edge weights!)

Thm: Consider the set  $S$  at any point in the algorithm

For each  $u \in S$ , the distance  $\text{dist}(u)$  is the shortest path distance  
(so  $\text{pred}(u)$  traces a shortest path).

pf: Induction on  $|S|$ :

Base Case:  $|S|=1$

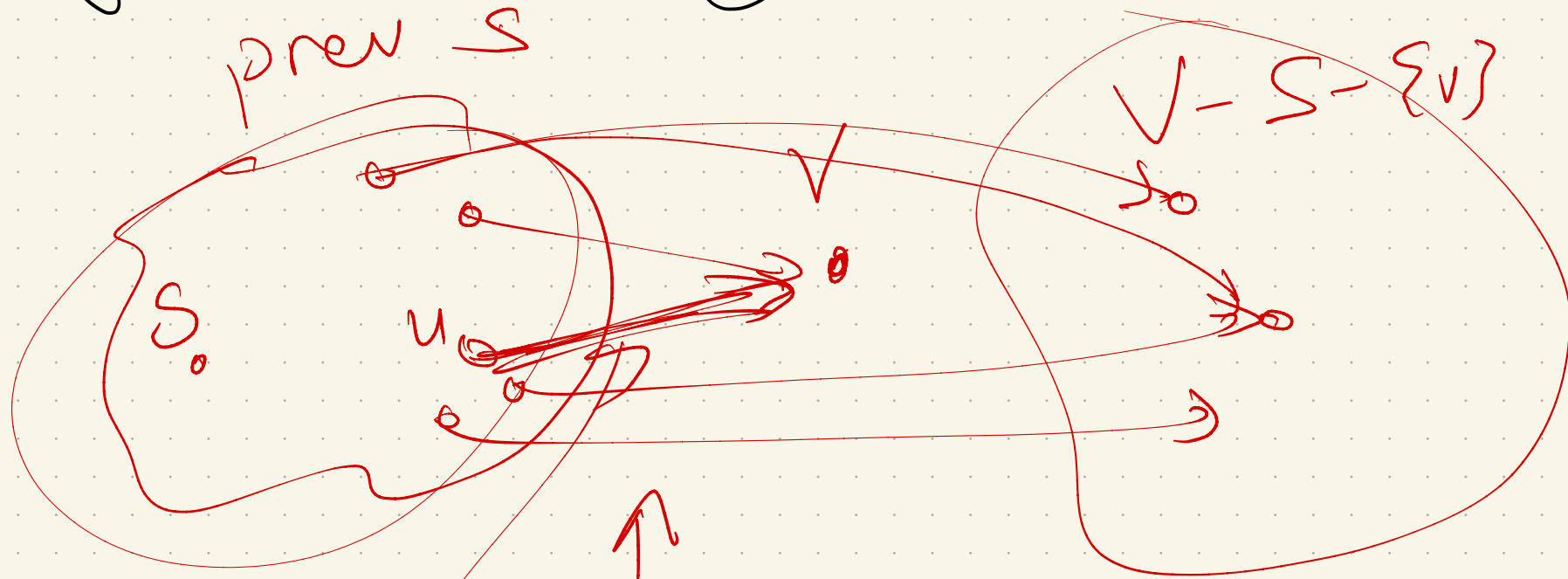
$$\text{dist}(s) = 0$$



IH: Spps claim holds when  $|S|=k-1$ .

Ind Step: Consider  $|S|=k$ :

algorithm is adding some  $v$  to  $S$



min:  
edges  
 $d(u) + w(u \rightarrow v)$

# Book's implementation:

When  $v$  is added to  $S$ :

- look at  $v$ 's edges and either insert  $w$  with key  $\text{dist}(v) + w(v \rightarrow w)$
- or update  $w$ 's key, if  $\text{dist}(v) + w(v \rightarrow w)$  beats current one

## NONNEGATIVEDIJKSTRA( $s$ ):

INITSSSP( $s$ )

for all vertices  $v$

**INSERT( $v, \text{dist}(v)$ )**

while the priority queue is not empty

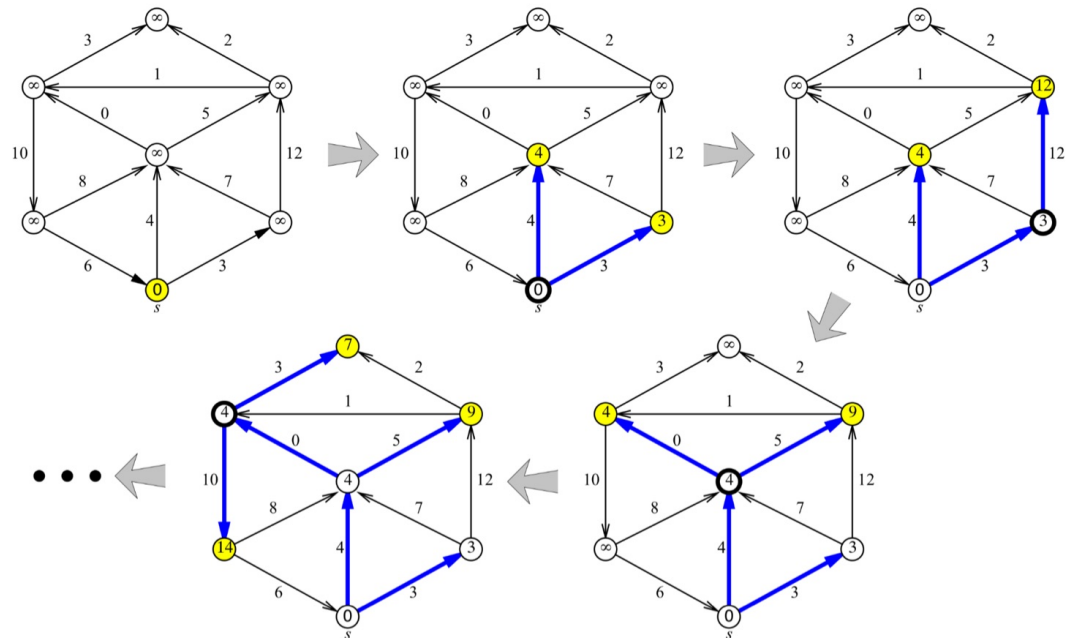
$u \leftarrow \text{EXTRACTMIN}()$

for all edges  $u \rightarrow v$

if  $u \rightarrow v$  is tense

RELAX( $u \rightarrow v$ )

**DECREASEKEY( $v, \text{dist}(v)$ )**



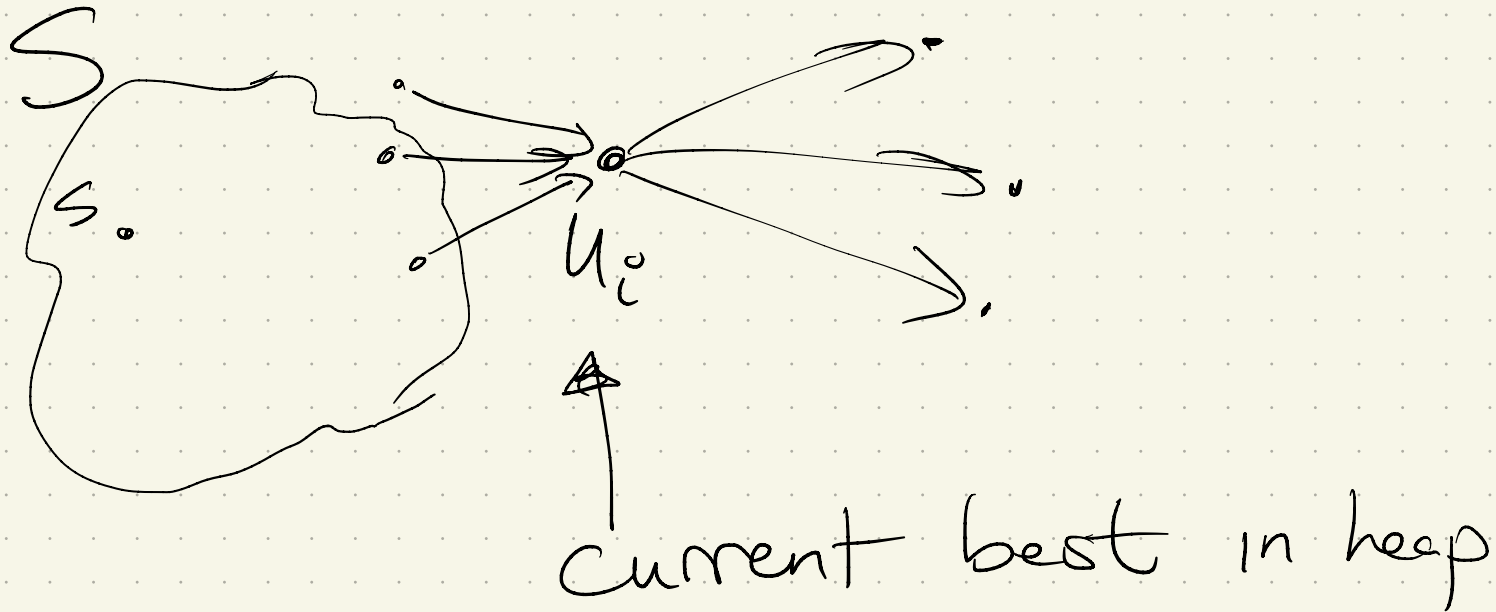
Four phases of Dijkstra's algorithm run on a graph with no negative edges. At each phase, the shaded vertices are in the heap, and the bold vertex has just been scanned. The bold edges describe the evolving shortest path tree.

Analysis: Let  $u_i$  be  $i^{\text{th}}$  vertex  
extracted from queue, & let  
 $d_i =$  value of  $\text{dist}(u_i)$  when extracted.

Lemma: If  $G$  has no negative edges,  
then for all  $i < j$ ,  $d_i \leq d_j$ .

Proof

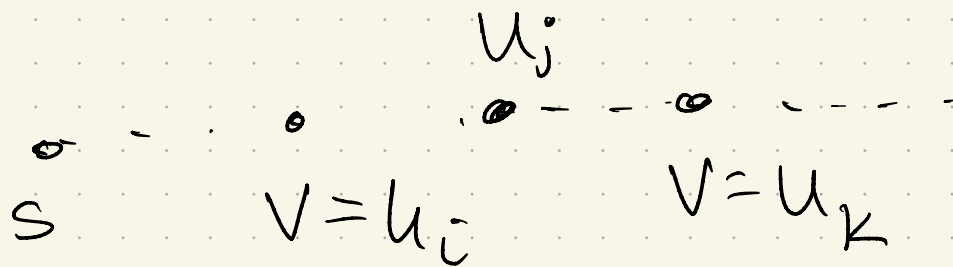
Fix an  $i$ :





Lemma: Each vertex is extracted from the heap once (or less)

Proof: Spps not:



prev lemma  $\Rightarrow$  know  $d_i \leq d_k$

But:  $v$  was readded to queue  
means some edge  $u_j \rightarrow v$   
became false.

Runtime: In the end, runtime is  $O(E \log V)$

Why?

decreasekey:

insert:

Extract Min:

NONNEGATIVEDIJKSTRA(s):

INITSSSP(s)

for all vertices  $v$

**INSERT**( $v, dist(v)$ )

while the priority queue is not empty

$u \leftarrow$  EXTRACTMIN()

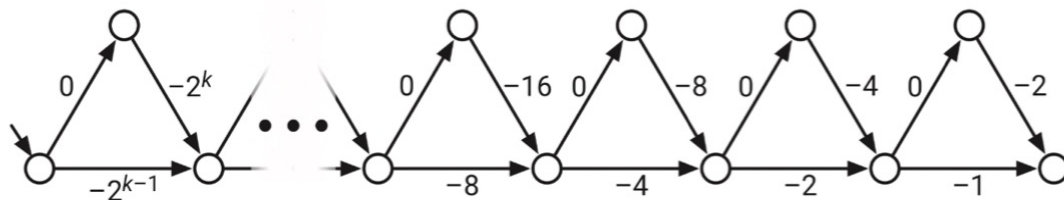
for all edges  $u \rightarrow v$

if  $u \rightarrow v$  is tense

RELAX( $u \rightarrow v$ )

**DECREASEKEY**( $v, dist(v)$ )

Main downside:

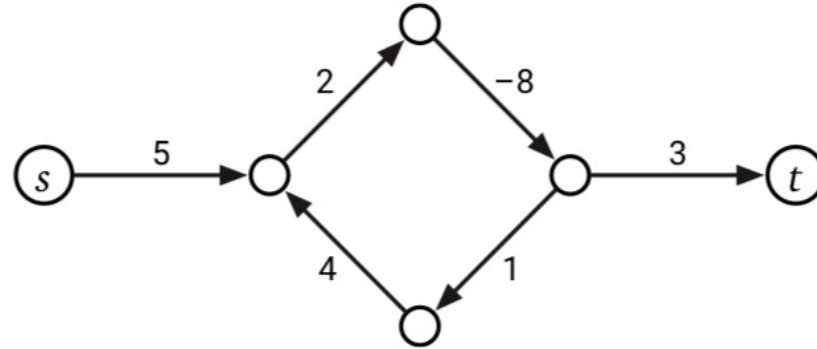


**Figure 8.14.** A directed graph with negative edges that forces DIJKSTRA to run in exponential time.

Next Monday:

How to deal with negative edges!

Note:



**Figure 8.3.** There is no shortest walk from  $s$  to  $t$ .