

#### 6.4: Single-Source Shortest Paths



Thomas Sauerwald



Lent 2016



Dijkstra's Algorithm





Source: Wikipedia

#### Edsger Wybe Dijkstra (1930-2002)

- Dutch computer scientist
- developed Dijkstra's shortest path algorithm in 1956 (and published in 1959)
- many more fundamental contributions to computer science and engineering
- Turing Award (1972)



"It is practically impossible to teach good programming to students that have had a prior exposure to BASIC: as potential programmers they are mentally mutilated beyond hope of regeneration."

"If you want more effective programmers, you will discover that they should not waste their time debugging, they should not introduce the bugs to start with."

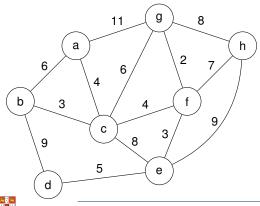
"FORTRAN's tragic fate has been its wide acceptance, mentally chaining thousands and thousands of programmers to our past mistakes."

"Programming is one of the most difficult branches of applied mathematics; the poorer mathematicians had better remain pure mathematicians."



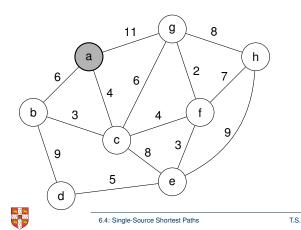
Basic Strategy

Start growing a tree from a designated root vertex

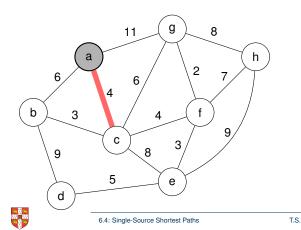




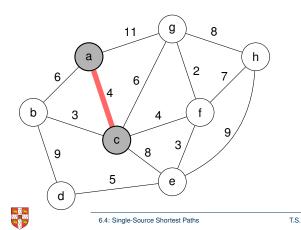
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- At each step, add lightest edge linked to A that does not yield cycle



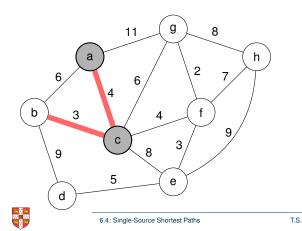
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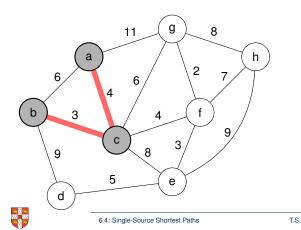
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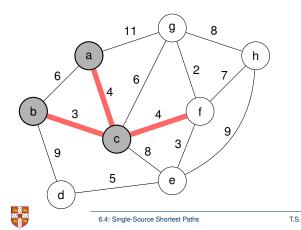
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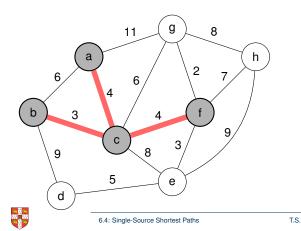
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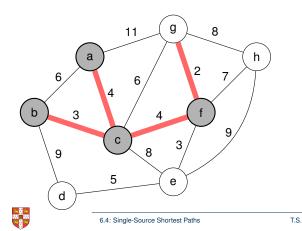
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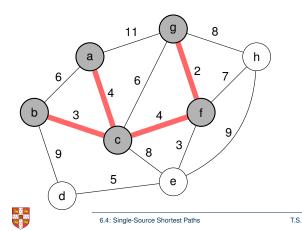


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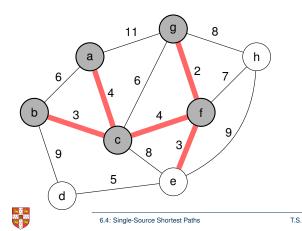
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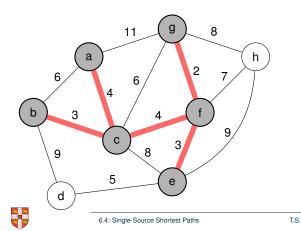


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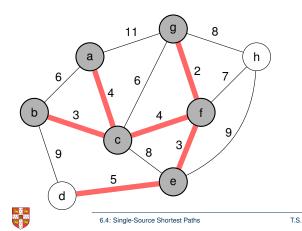
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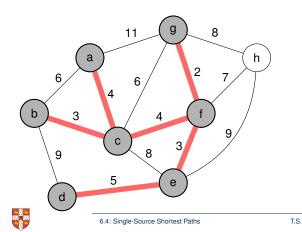
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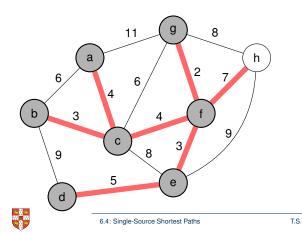
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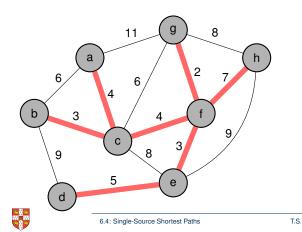
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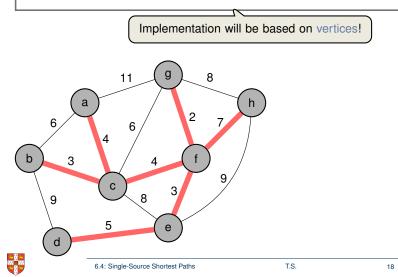
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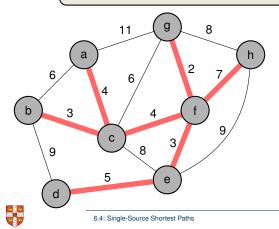
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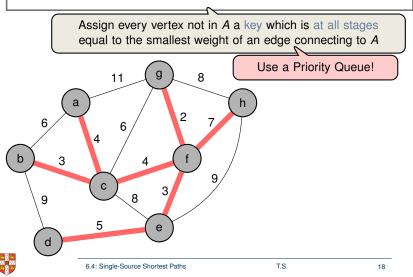
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Assign every vertex not in A a key which is at all stages equal to the smallest weight of an edge connecting to A

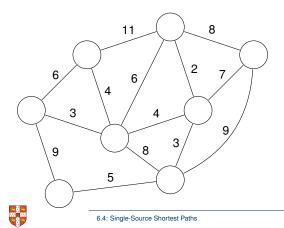


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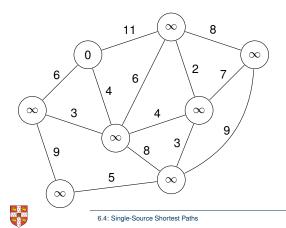
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- Every vertex in Q has key and pointer of least-weight edge to  $V \setminus Q$
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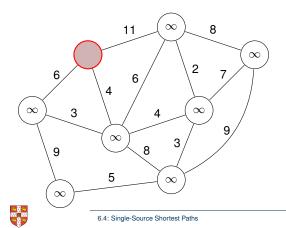
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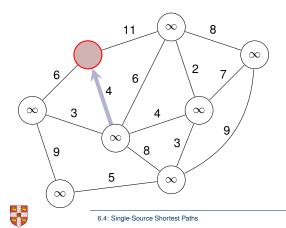
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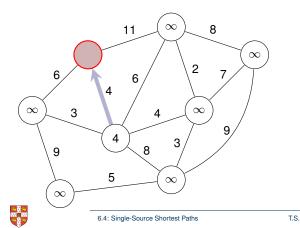


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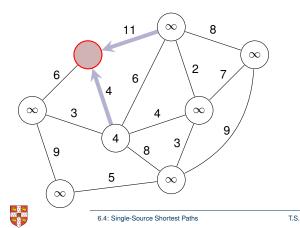
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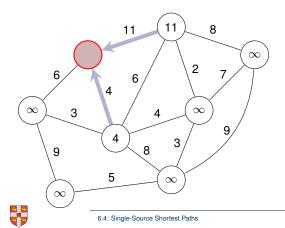


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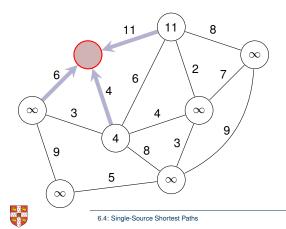
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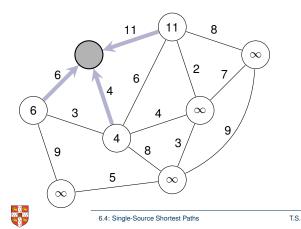


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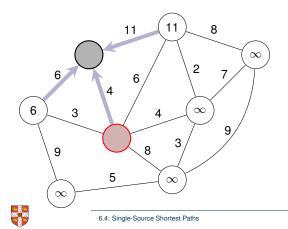
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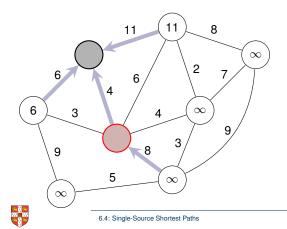
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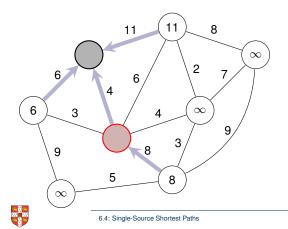
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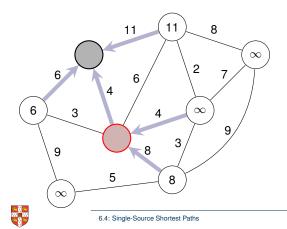
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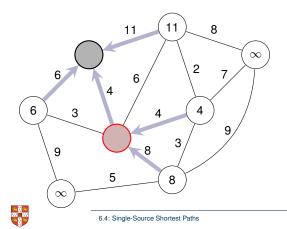
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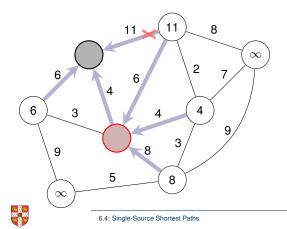
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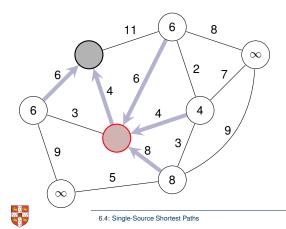
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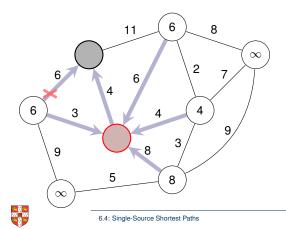
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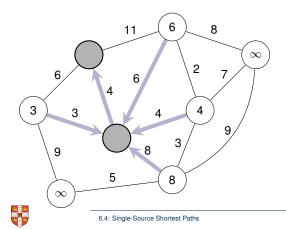
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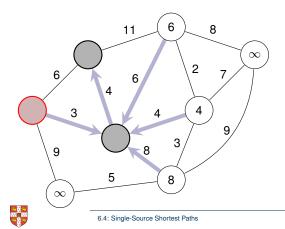


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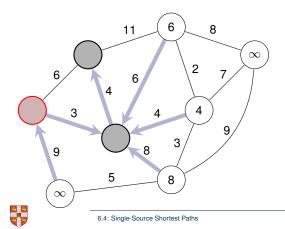
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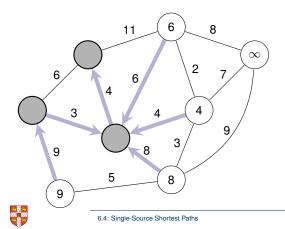
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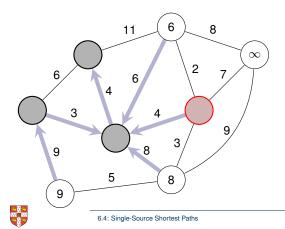


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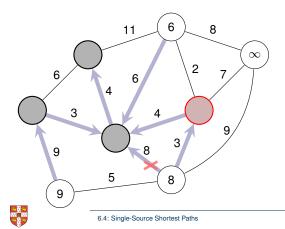
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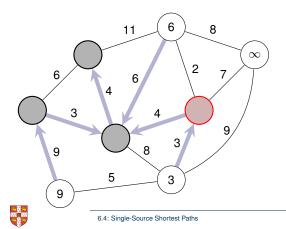
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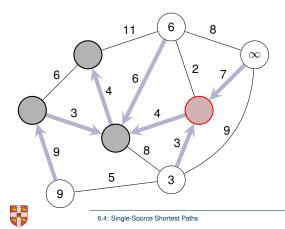
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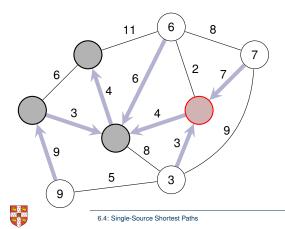


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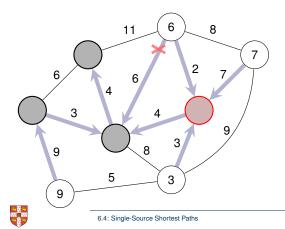
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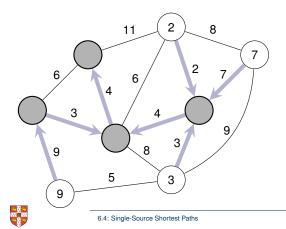


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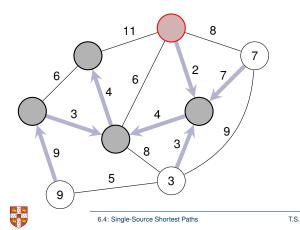
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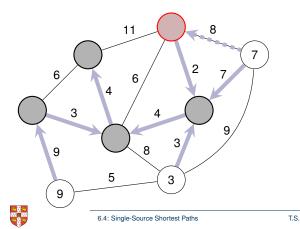
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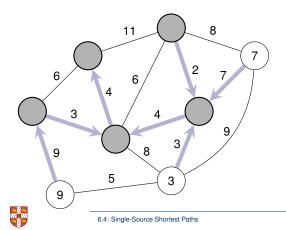


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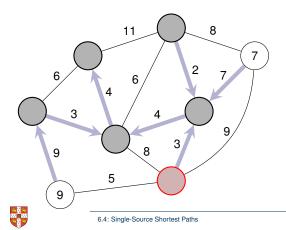
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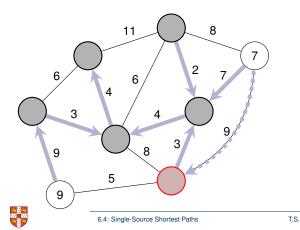
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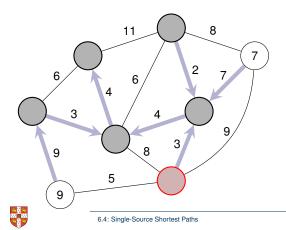


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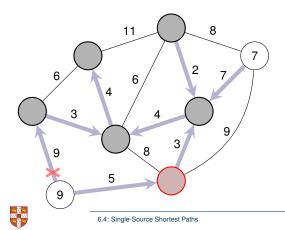


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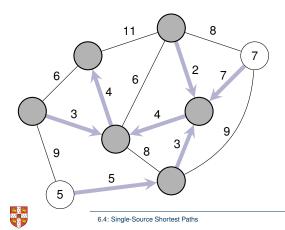
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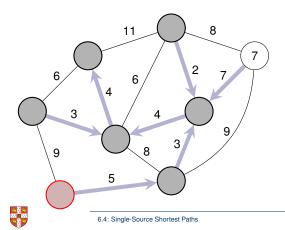
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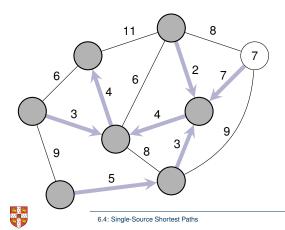
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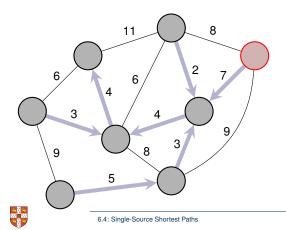


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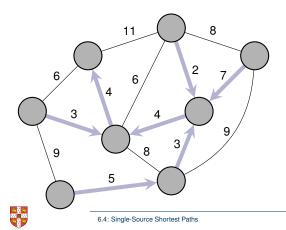


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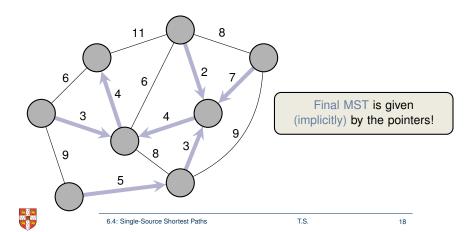
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  - 2. update keys and pointers of its neighbors in Q



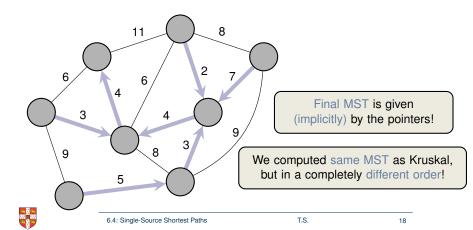
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#### Prim's Algorithm —

- Grows a tree that will eventually become a (minimum) spanning tree
- A is the set of vertices which have been connected so far
- Value of a vertex:
  - If  $u \in A$ , then it has no value.
  - If  $u \notin A$ , then it is equal to the smallest weight of an edge connecting to A (if such edge exists, otherwise  $\infty$ .)

#### Dijsktra's Algorithm

- Grows a tree that will eventually become a shortest-path tree
- S is the set of vertices in the (current) shortest-path tree
- Value of a vertex:
  - If  $u \in S$ , then it is the actual distance from the source *s* to *u*.
  - If  $u \notin S$ , then it may be any value (including  $\infty$ ) that is at least the distance from the source *s*.



Overview of Dijkstra

- Requires that all edges have non-negative weights
- Use a special order for relaxing edges



Overview of Dijkstra ------

- Requires that all edges have non-negative weights
- Use a special order for relaxing edges
- The order follows a greedy-strategy (similar to Prim's algorithm):



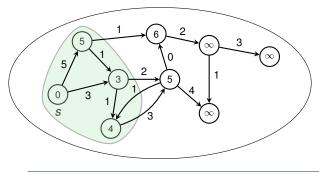
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Overview of Dijkstra -

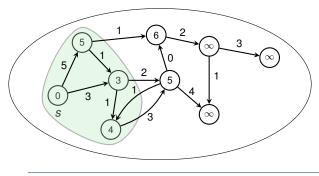
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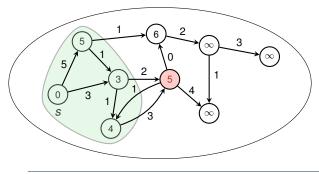
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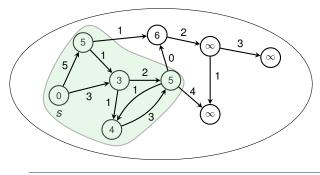
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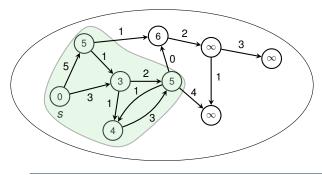


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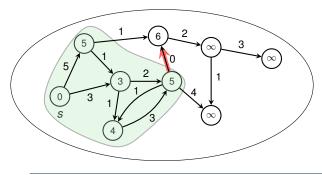


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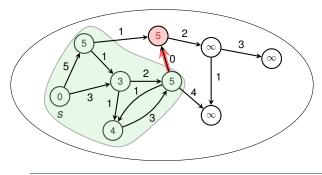


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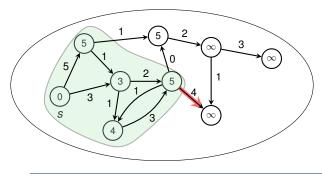


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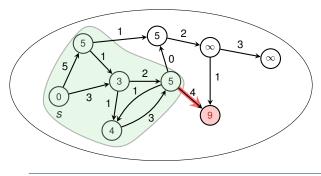


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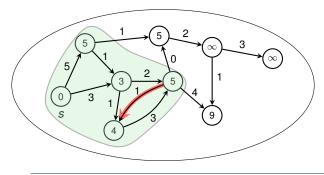


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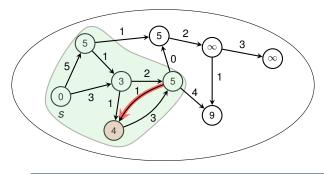


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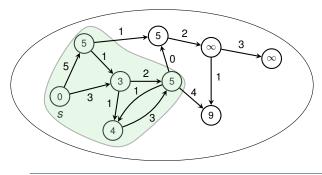


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Overview of Dijkstra

Requires that all edges have non-negative weights

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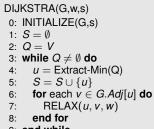
#### DIJKSTRA(G,w,s) 0: INITIALIZE(G,s) 1: $S = \emptyset$ 2: Q = V3: while $Q \neq \emptyset$ do 4: u = Extract-Min(Q)5: $S = S \cup \{u\}$ 6: for each $v \in G.Adj[u]$ do 7: RELAX(u, v, w)8: end for

9: end while

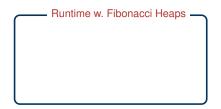


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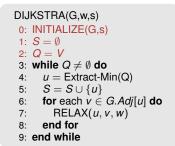




9: end while













— Runtime w. Fibonacci Heaps

Initialization (I. 0-2): O(V)



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- 3: while  $Q \neq \emptyset$  do
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- 7:  $\mathsf{RELAX}(u, v, w)$
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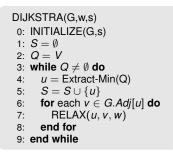
7: 
$$\mathsf{RELAX}(u, v, w)$$

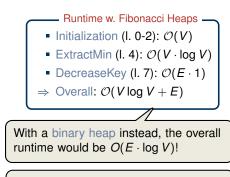
- 8: end for
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$$\Rightarrow$$
 Overall:  $\mathcal{O}(V \log V + E)$ 

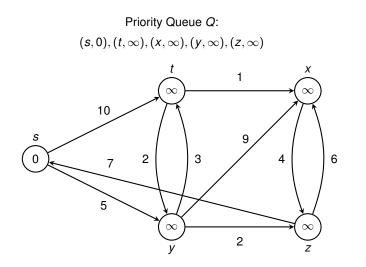




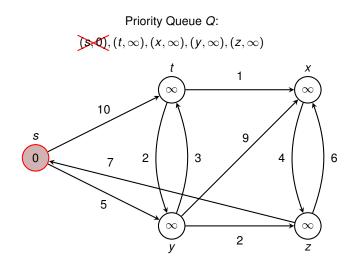


Prim's algorithm has the same runtime!

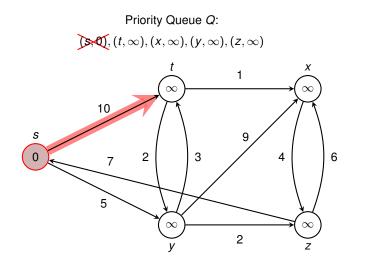




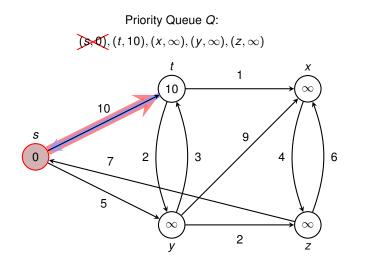




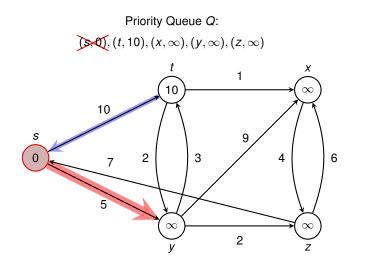




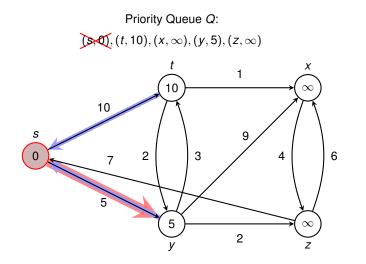




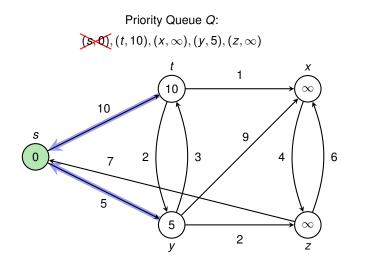




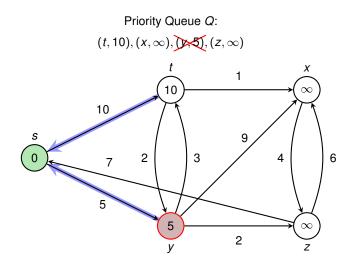




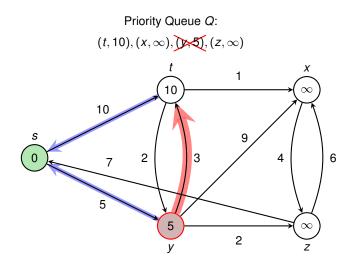




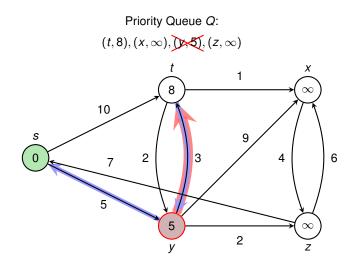




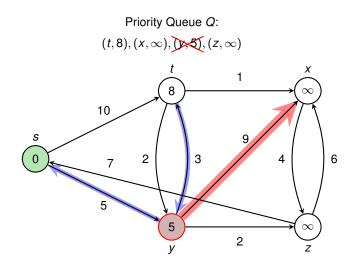




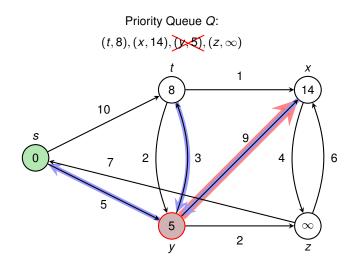




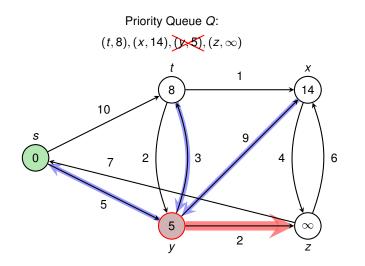




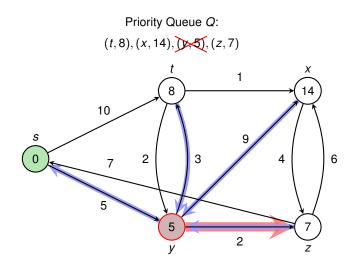






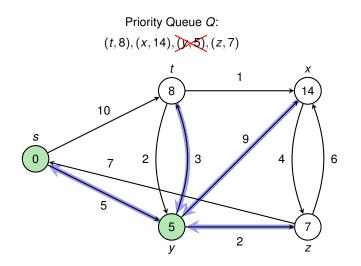




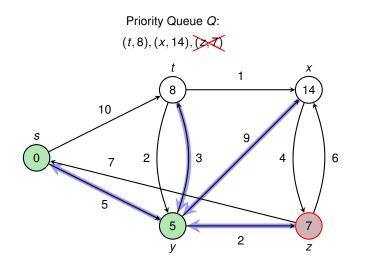




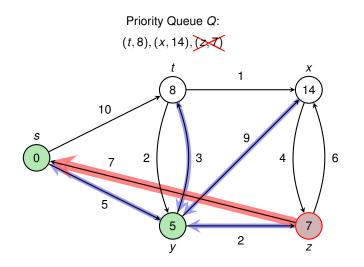
# **Execution of Dijkstra (Figure 24.6)**



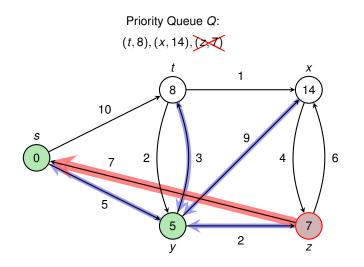




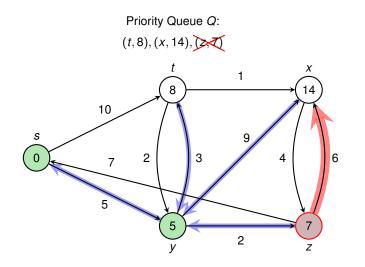




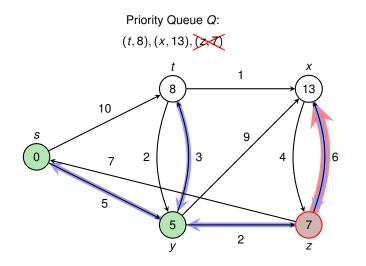




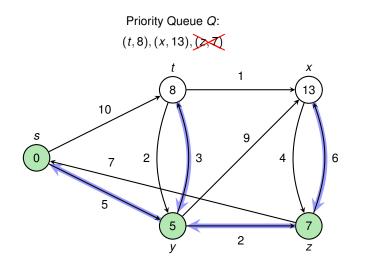




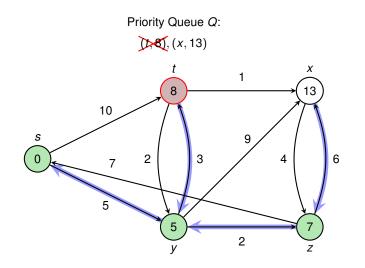




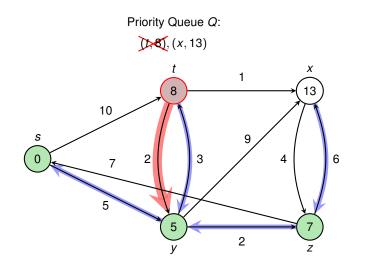




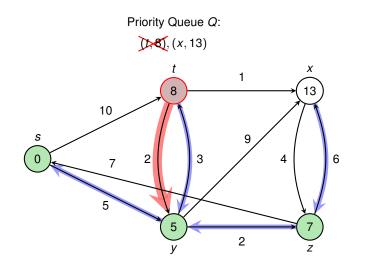




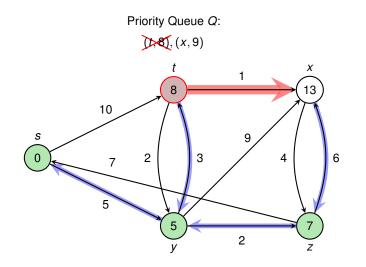




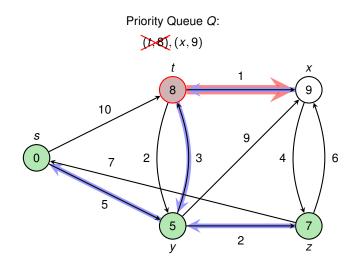




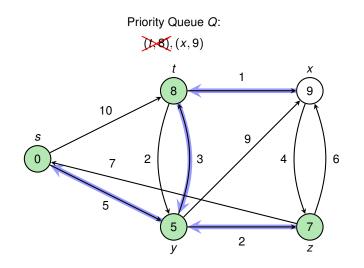




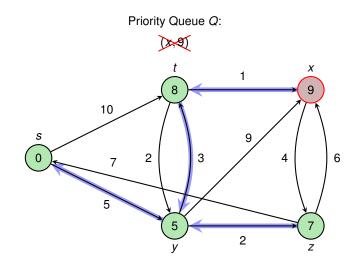




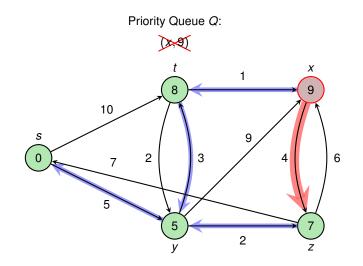




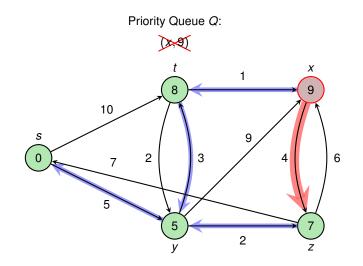




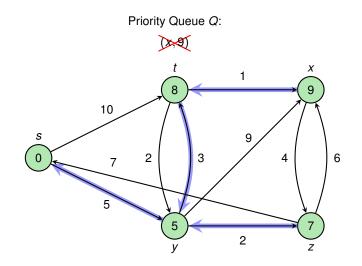












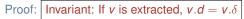


For any directed graph G = (V, E) with non-negative edge weights  $w : E \to \mathbb{R}^+$  and source *s*, Dijkstra terminates with  $u.d = u.\delta$  for all  $u \in V$ .

**Proof:** Invariant: If *v* is extracted,  $v.d = v.\delta$ 



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• Suppose there is  $u \in V$ , when extracted,

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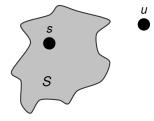
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• Let *u* be the first vertex with this property





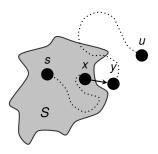
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- Take a shortest path from s to u and let (x, y) be the first edge from S to V \ S





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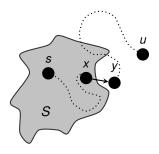


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u.d





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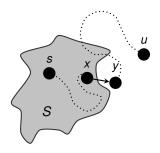


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- Take a shortest path from s to u and let (x, y) be the first edge from S to V \ S

$$u.d \leq y.d$$





For any directed graph G = (V, E) with non-negative edge weights  $w : E \to \mathbb{R}^+$  and source *s*, Dijkstra terminates with  $u.d = u.\delta$  for all  $u \in V$ .

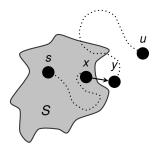


• Suppose there is  $u \in V$ , when extracted,

 $u.d > u.\delta$ 

- Let *u* be the first vertex with this property
- Take a shortest path from s to u and let (x, y) be the first edge from S to V \ S

$$u.d \le y.d$$
  
 $u$  is extracted before  $y$ 





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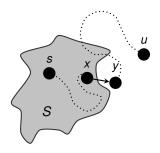


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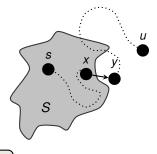
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since  $x.d = x.\delta$  when x is extracted, and then (x, y) is relaxed  $\Rightarrow$  Convergence Property





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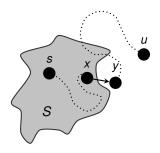


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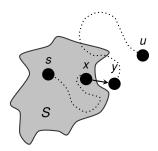
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This contradicts that y is on a shortest path from s to u.





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**Proof:** Invariant: If v is extracted,  $v.d = v.\delta$ 

• Suppose there is  $u \in V$ , when extracted,

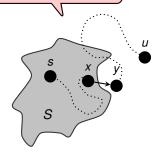
# $u.d > u.\delta$

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 $u.\delta < u.d < v.d = v.\delta$ 

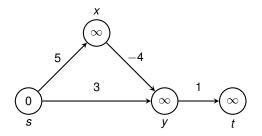
This contradicts that y is on a shortest path from s to u.

There are edge cases like s = x and/or y = u!



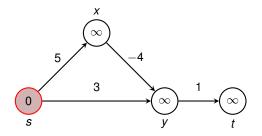


Priority Queue *Q*:  $(s,0), (t,\infty), (x,\infty), (y,\infty)$ 



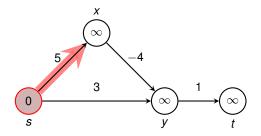


Priority Queue *Q*:  $(t,\infty), (x,\infty), (y,\infty)$ 



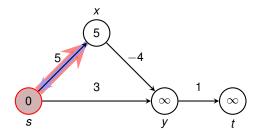


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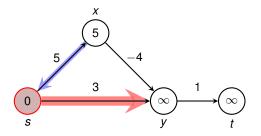


Priority Queue *Q*:  $(t, \infty), (x, 5), (y, \infty)$ 



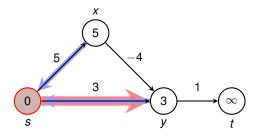


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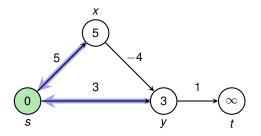


Priority Queue Q: (x,  $\infty$ ), (x, 5), (y, 3)



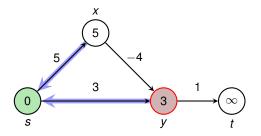


Priority Queue Q: ( $t, \infty$ ), (t, 5), (y, 3)



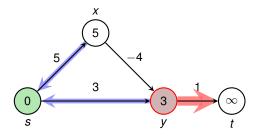


Priority Queue Q:  $(t, \infty), (x, 4), \bigcirc$ 



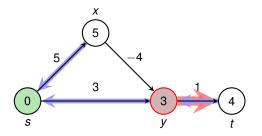


Priority Queue Q:  $(t,\infty), (x,4), ($ 



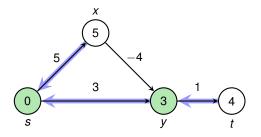


Priority Queue Q: (t, 4), (x, 5), (x,

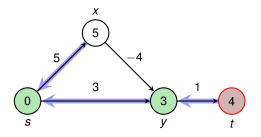




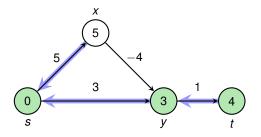
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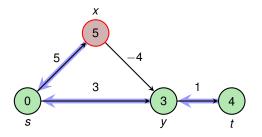




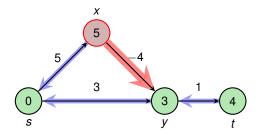




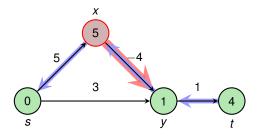




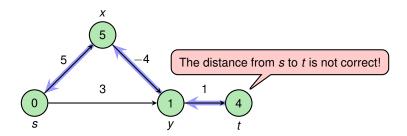














## Summary of Single-Source Shortest Paths

Overview

- studied two algorithms for SSSP (single-source shortest path)
- basic operation: relaxing edges



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- V passes of relaxing all edges (arbitrary order)
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#### Dijkstra's Algorithm

- requires non-negative weights
- Greeedy strategy to choose which edge to relax (similar to Prim)
- Using Fibonacci Heaps  $\Rightarrow$  Runtime  $\mathcal{O}(V \log V + E)$

