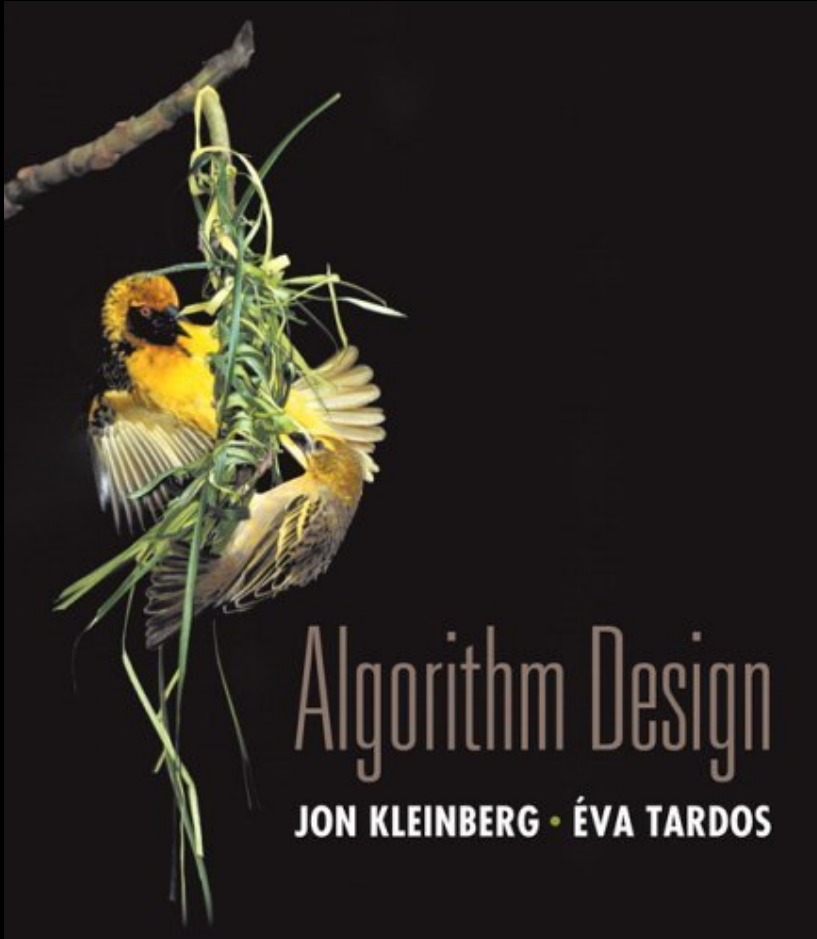


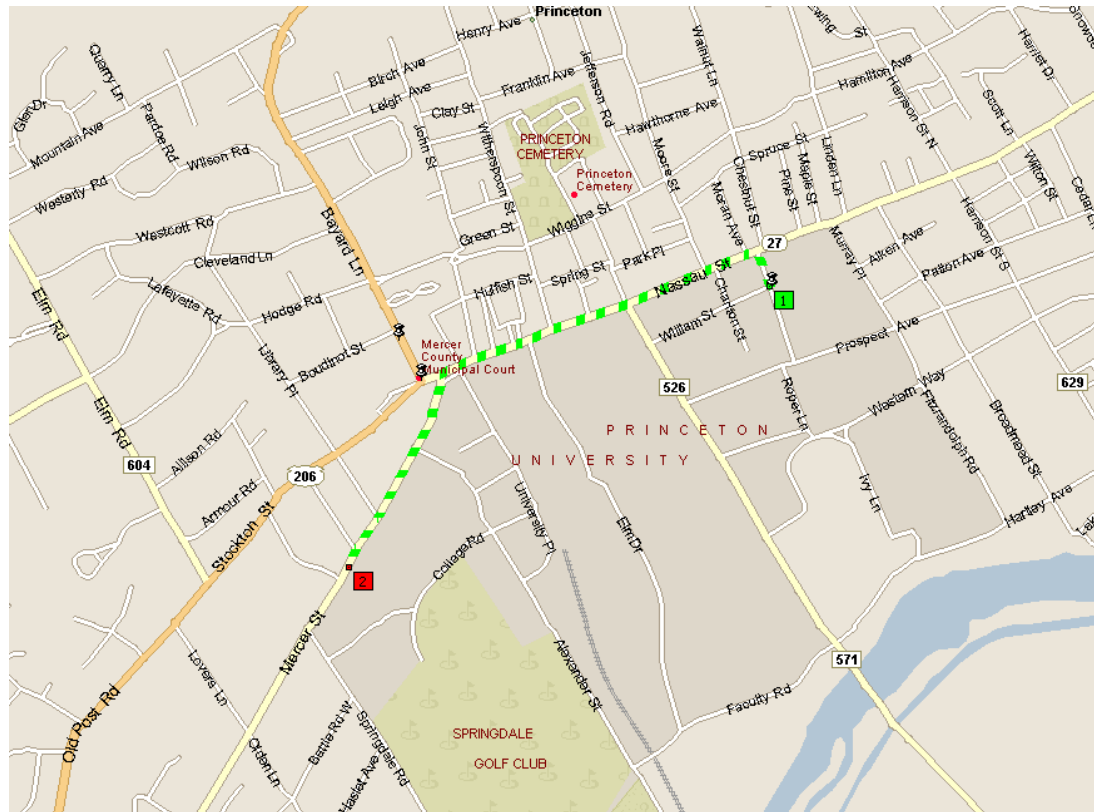
Chapter 4

Greedy Algorithms



Slides by Kevin Wayne.
Copyright © 2005 Pearson-Addison Wesley.
All rights reserved.

4.4 Shortest Paths in a Graph



shortest path from Princeton CS department to Einstein's house

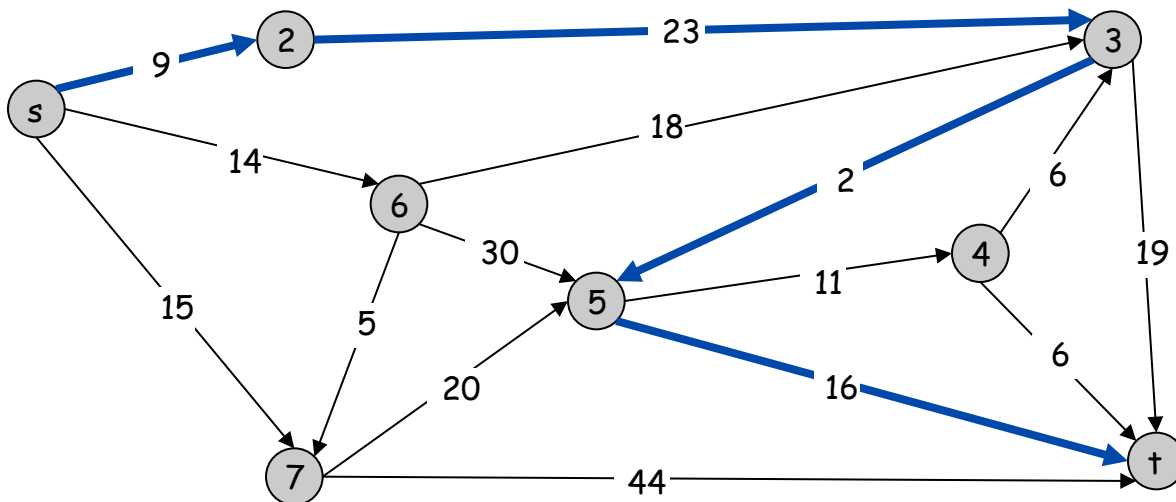
Shortest Path Problem

Shortest path network.

- Directed graph $G = (V, E)$.
- Source s , destination t .
- Length $\ell_e =$ length of edge e .

Shortest path problem: find shortest directed path from s to t .

↑
cost of path = sum of edge costs in path



Cost of path $s-2-3-5-t$
 $= 9 + 23 + 2 + 16$
 $= 48.$

Dijkstra's Algorithm

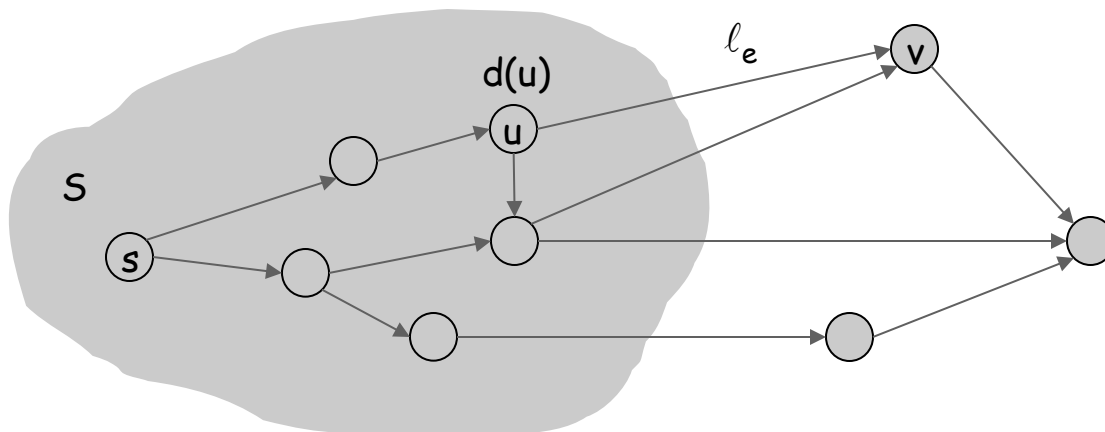
Dijkstra's algorithm.

- Maintain a set of **explored nodes** S for which we have determined the shortest path distance $d(u)$ from s to u .
- Initialize $S = \{s\}$, $d(s) = 0$.
- Repeatedly choose unexplored node v which minimizes

$$\pi(v) = \min_{e = (u,v) : u \in S} d(u) + \ell_e,$$

add v to S , and set $d(v) = \pi(v)$.

shortest path to some u in explored part, followed by a single edge (u, v)



Dijkstra's Algorithm

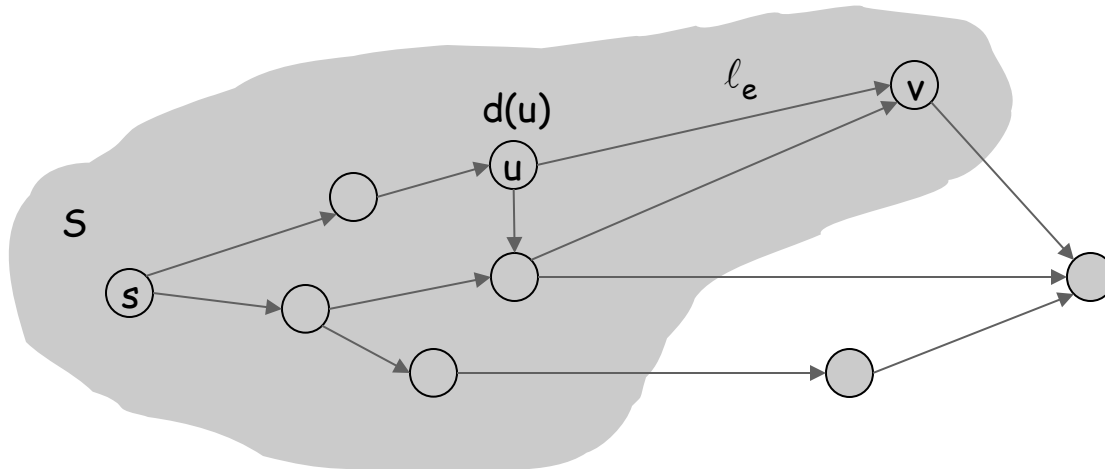
Dijkstra's algorithm.

- Maintain a set of **explored nodes** S for which we have determined the shortest path distance $d(u)$ from s to u .
- Initialize $S = \{s\}$, $d(s) = 0$.
- Repeatedly choose unexplored node v which minimizes

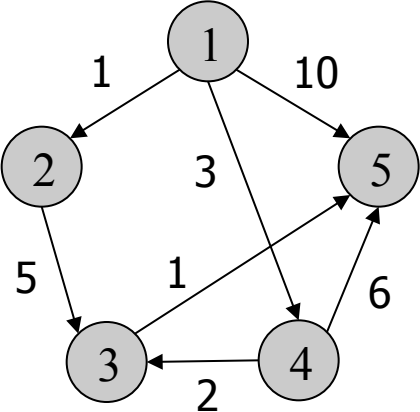
$$\pi(v) = \min_{e = (u,v) : u \in S} d(u) + \ell_e,$$

add v to S , and set $d(v) = \pi(v)$.

shortest path to some u in explored part, followed by a single edge (u, v)



Dijkstra's Algorithm

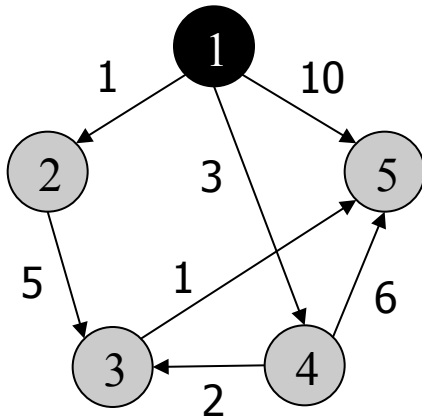


$S = \emptyset$

$D =$

	∞	∞	∞	∞
1	2	3	4	5

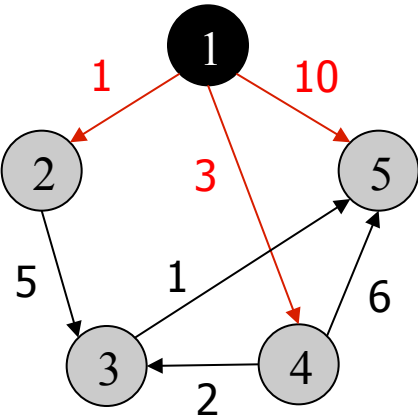
Dijkstra's Algorithm



$$S = \{1\}$$

$$D = \begin{array}{|c|c|c|c|c|} \hline \blacksquare & \infty & \infty & \infty & \infty \\ \hline 1 & 2 & 3 & 4 & 5 \\ \hline \end{array}$$

Dijkstra's Algorithm

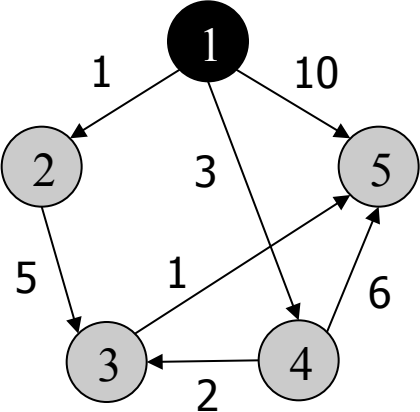


$$S = \{1\}$$

D =

	1	∞	3	10	
	1	2	3	4	5

Dijkstra's Algorithm

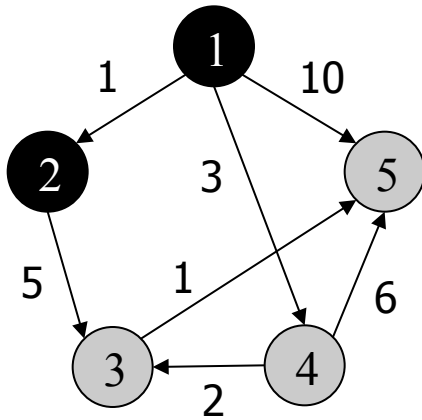


$S = \{1\}$
 $D =$

	1	∞	3	10	
	1	2	3	4	5

↑

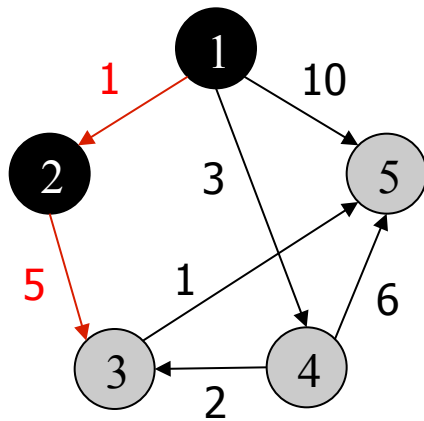
Dijkstra's Algorithm



$$S = \{1, 2\}$$

$$D = \begin{array}{|c|c|c|c|c|} \hline & 1 & 2 & 3 & 4 & 5 \\ \hline 1 & 1 & \infty & 3 & 10 & \\ \hline \end{array}$$

Dijkstra's Algorithm

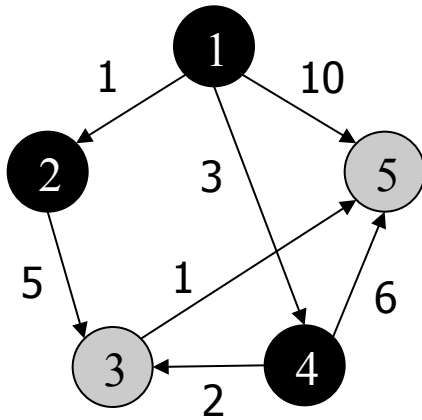


$S = \{1, 2\}$

$D =$

	1	6	3	10	
	1	2	3	4	5

Dijkstra's Algorithm



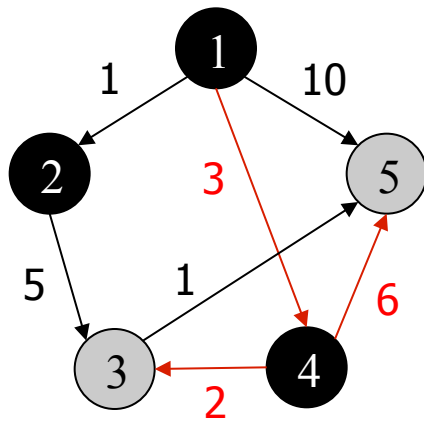
$S = \{1, 2, 4\}$

$D =$

	1	6	3	10	
	1	2	3	4	5

↑

Dijkstra's Algorithm

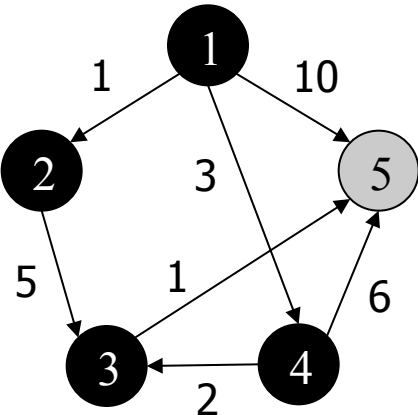


$S = \{1, 2, 4\}$

$D =$

	1	5	3	9	
	1	2	3	4	5

Dijkstra's Algorithm

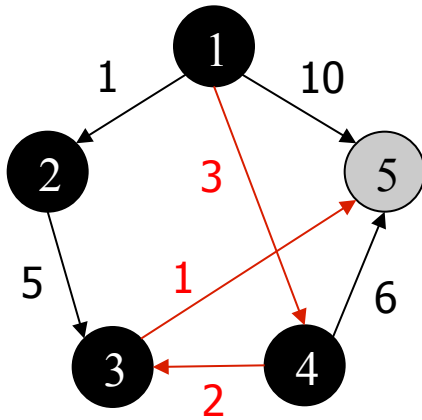


$S = \{1, 2, 4, 3\}$
 $D =$

1	5	3	9	
1	2	3	4	5

↑

Dijkstra's Algorithm

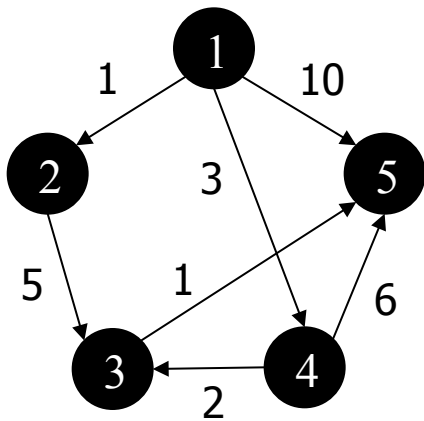


$S = \{1, 2, 4, 3\}$

$D =$

1	5	3	6	
1	2	3	4	5

Dijkstra's Algorithm



$S = \{1, 2, 4, 3, 5\}$

$D =$

1	5	3	6	
1	2	3	4	5

Dijkstra's Algorithm: Proof of Correctness

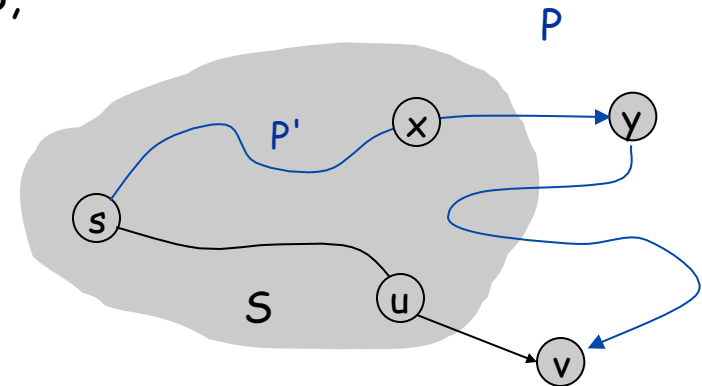
Invariant. For each node $u \in S$, $d(u)$ is the length of the shortest s - u path.

Pf. (by induction on $|S|$)

Base case: $|S| = 1$ is trivial.

Inductive hypothesis: Assume true for $|S| = k \geq 1$.

- Let v be next node added to S , and let u - v be the chosen edge.
- The shortest s - u path plus (u, v) is an s - v path of length $\pi(v)$.
- Consider any s - v path P . We'll see that it's no shorter than $\pi(v)$.
- Let x - y be the first edge in P that leaves S , and let P' be the subpath to x .
- P is already too long as soon as it leaves S .



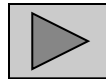
$$\begin{array}{ccccccc} \ell(P) & \geq & \ell(P') + \ell(x, y) & \geq & d(x) + \ell(x, y) & \geq & \pi(y) \geq \pi(v) \\ \uparrow & & \uparrow & & \uparrow & & \uparrow \\ \text{nonnegative} & & \text{inductive} & & \text{defn of } \pi(y) & & \text{Dijkstra chose } v \\ \text{weights} & & \text{hypothesis} & & & & \text{instead of } y \end{array}$$

Dijkstra's Algorithm: Implementation

For each unexplored node, explicitly maintain $\pi(v) = \min_{e=(u,v): u \in S} d(u) + \ell_e$.

- Next node to explore = node with minimum $\pi(v)$.
- When exploring v , for each incident edge $e = (v, w)$, update $\pi(w) = \min \{ \pi(w), \pi(v) + \ell_e \}$.

Efficient implementation. Maintain a priority queue of unexplored nodes, prioritized by $\pi(v)$.

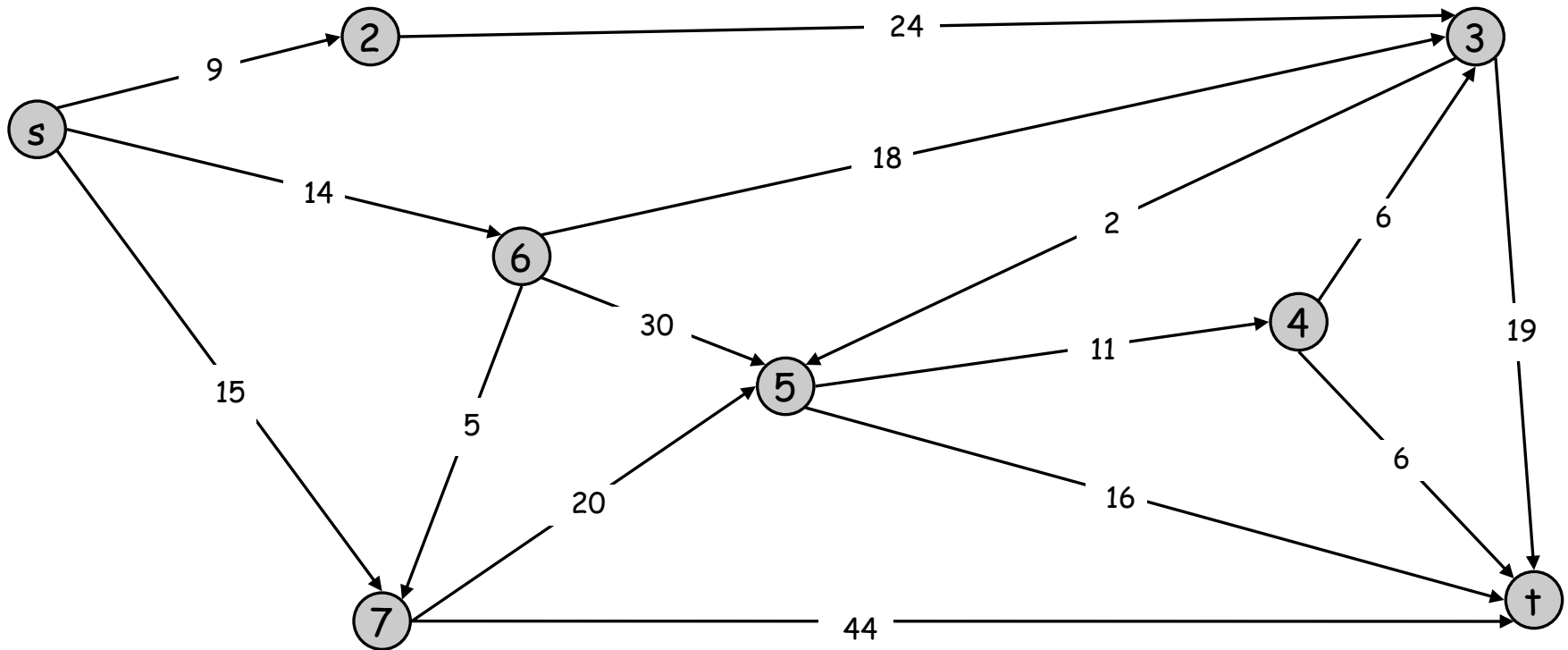


PQ Operation	Dijkstra	Array	Binary heap	d-way Heap	Fib heap †
Insert	n	n	$\log n$	$d \log_d n$	1
ExtractMin	n	n	$\log n$	$d \log_d n$	$\log n$
ChangeKey	m	1	$\log n$	$\log_d n$	1
IsEmpty	n	1	1	1	1
Total		n^2	$m \log n$	$m \log_{m/n} n$	$m + n \log n$

† Individual ops are amortized bounds

Dijkstra's Shortest Path Algorithm

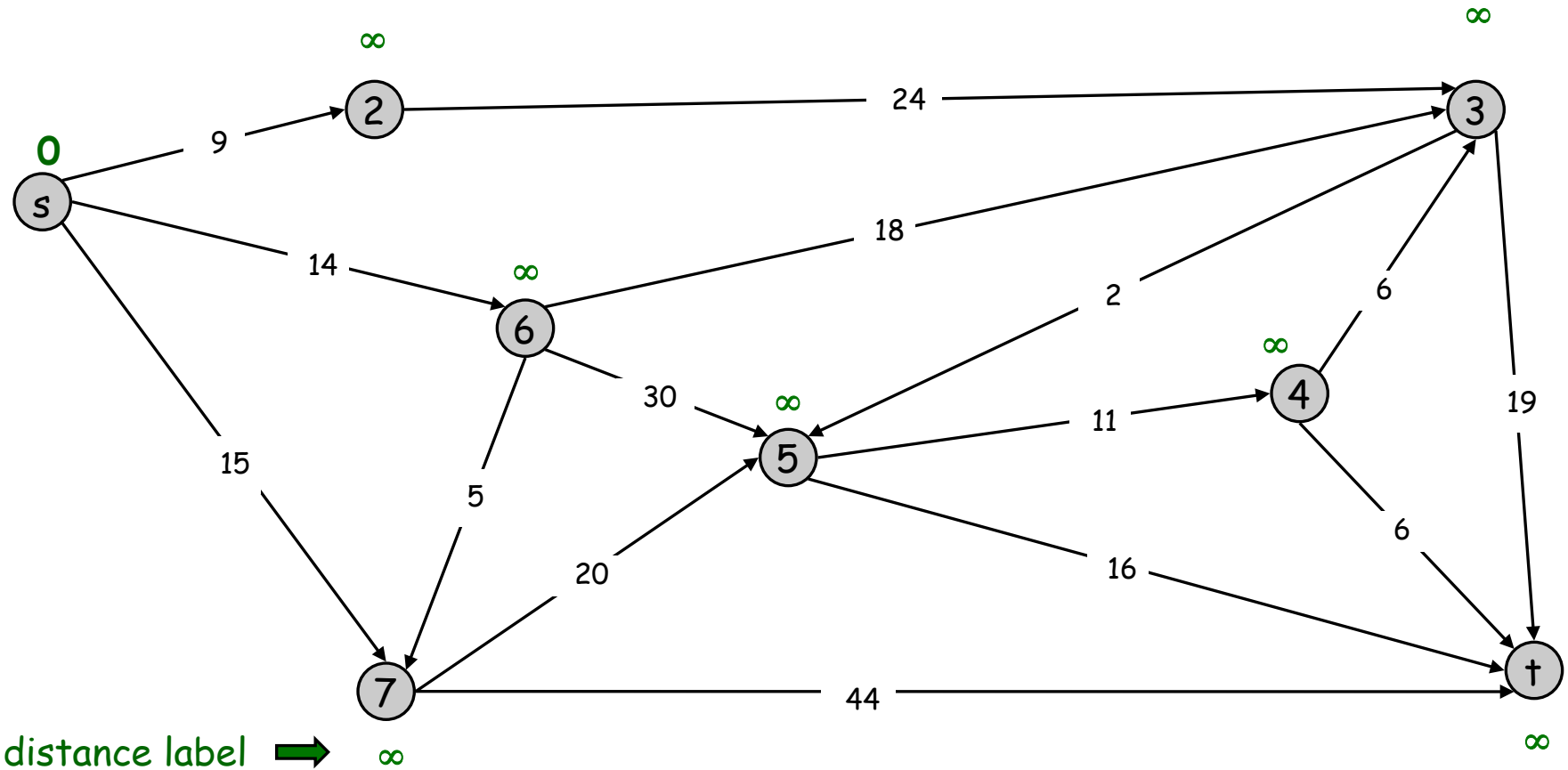
Find shortest path from s to t.



Dijkstra's Shortest Path Algorithm

$S = \{ \}$

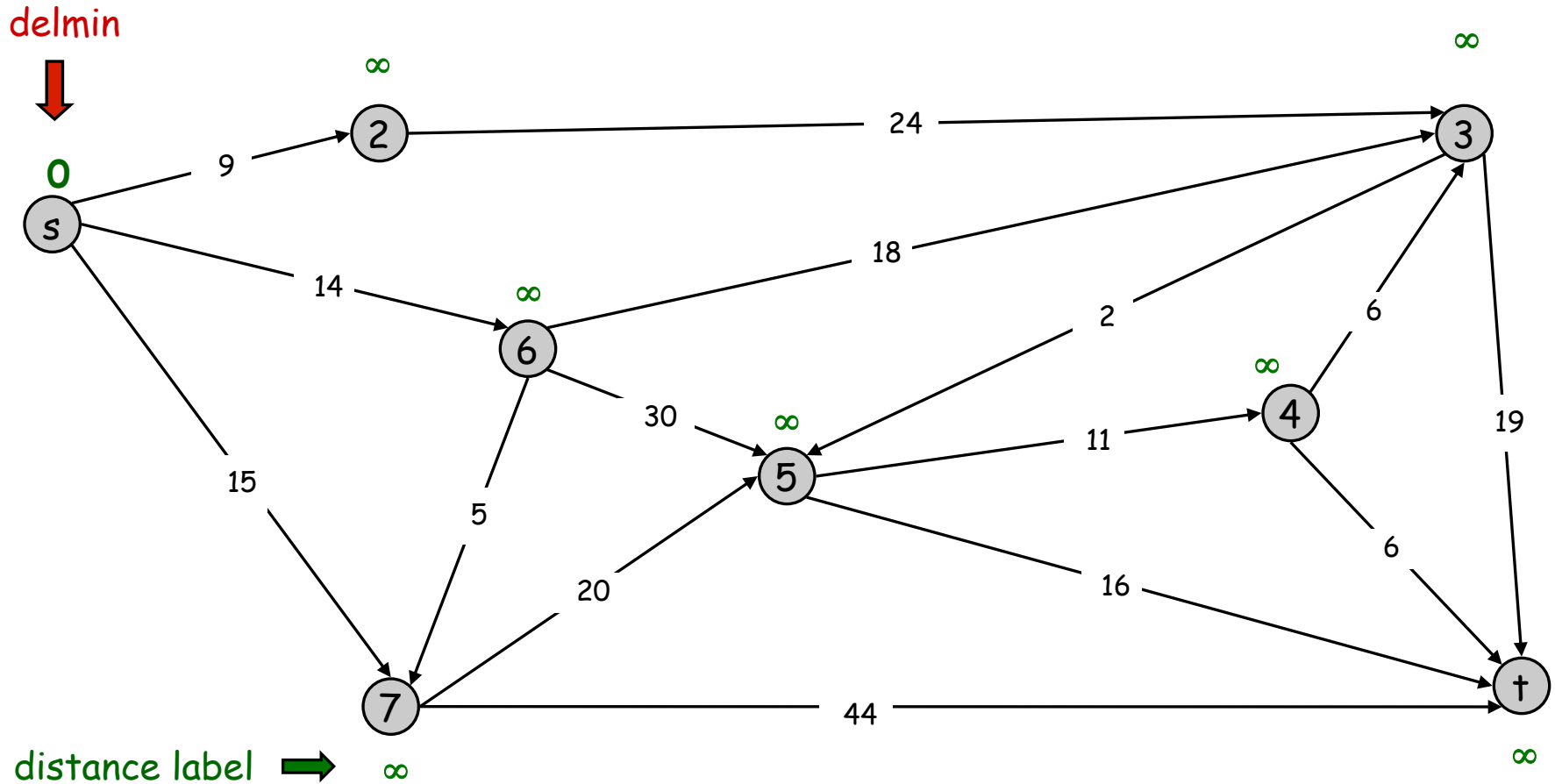
$PQ = \{ s, 2, 3, 4, 5, 6, 7, t \}$



Dijkstra's Shortest Path Algorithm

$S = \{ \}$

$PQ = \{ s, 2, 3, 4, 5, 6, 7, t \}$



Dijkstra's Shortest Path Algorithm

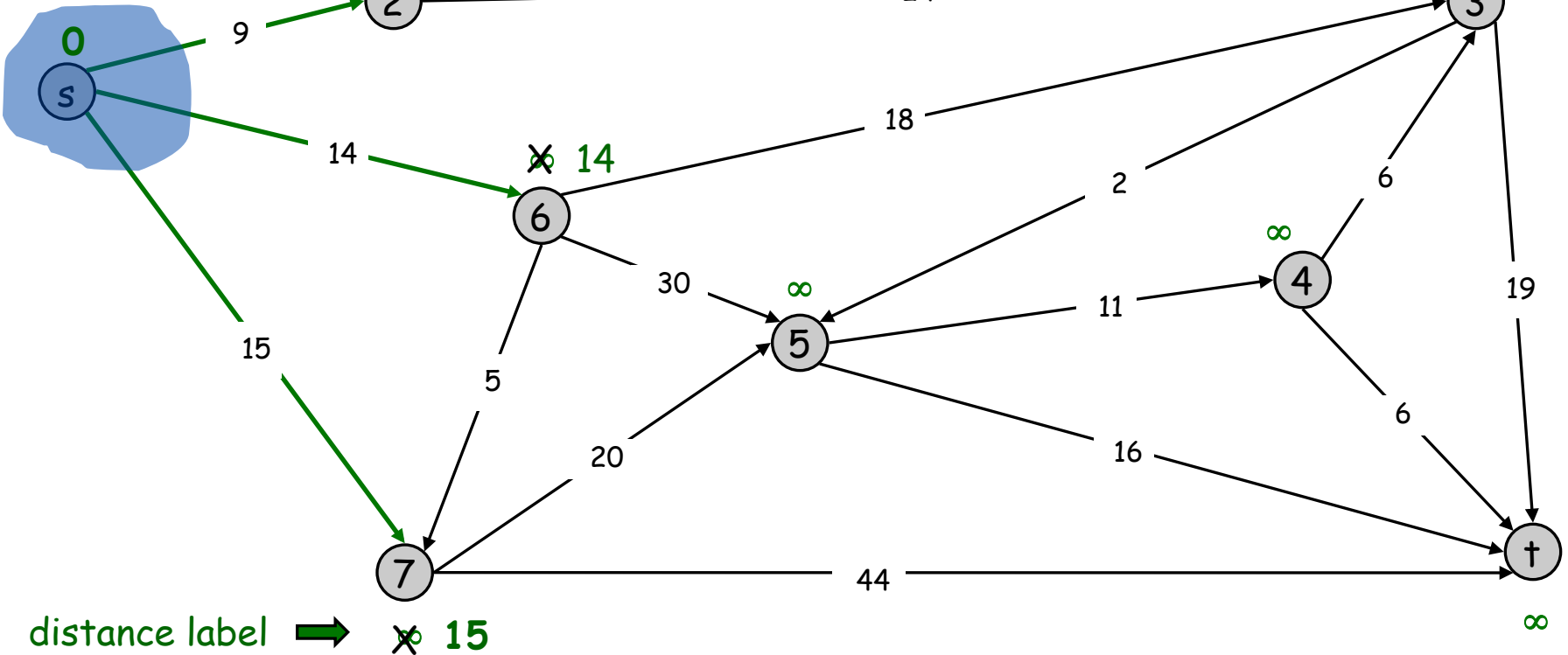
$S = \{s\}$

$PQ = \{2, 3, 4, 5, 6, 7, t\}$

decrease key



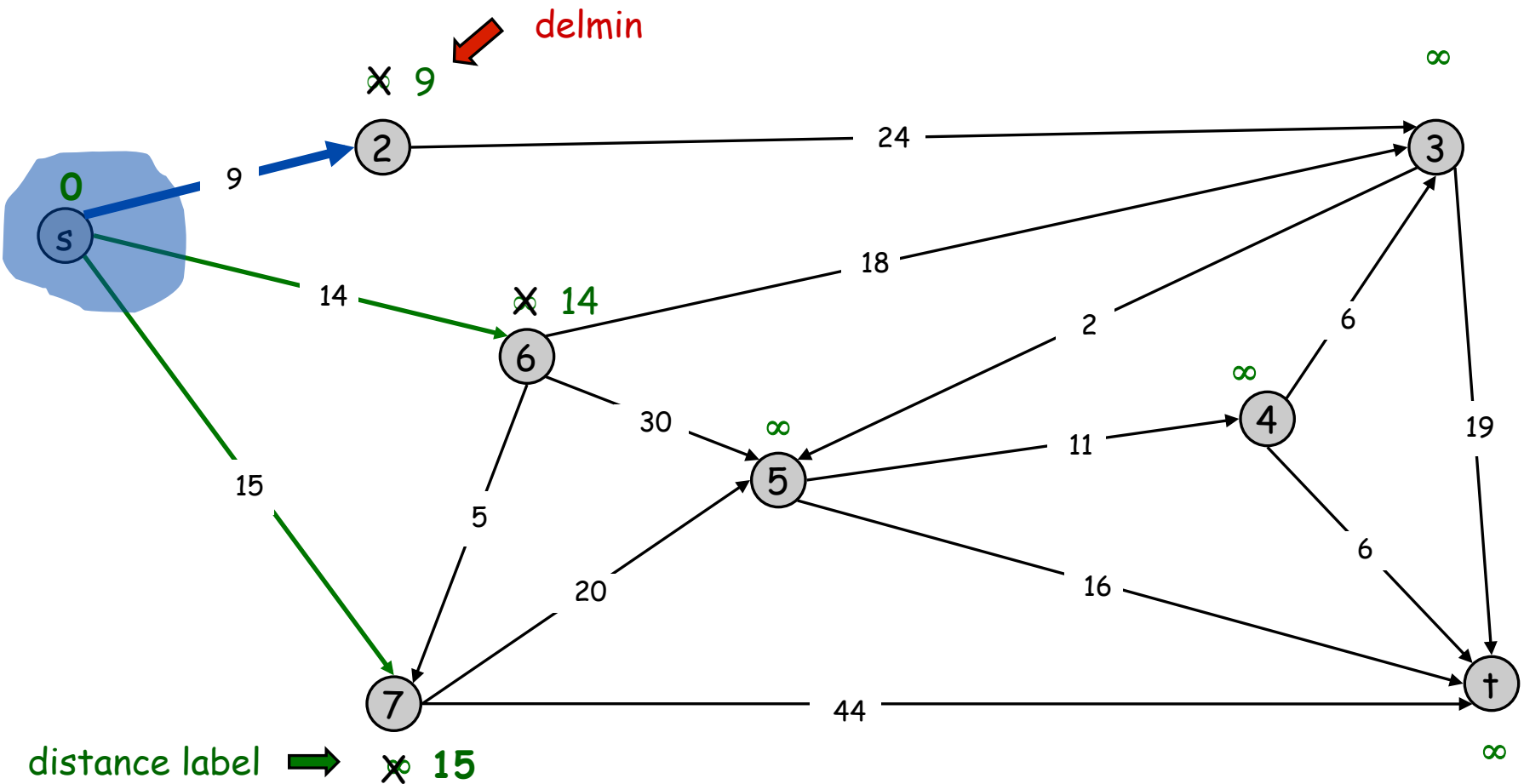
~~9~~



Dijkstra's Shortest Path Algorithm

$S = \{s\}$

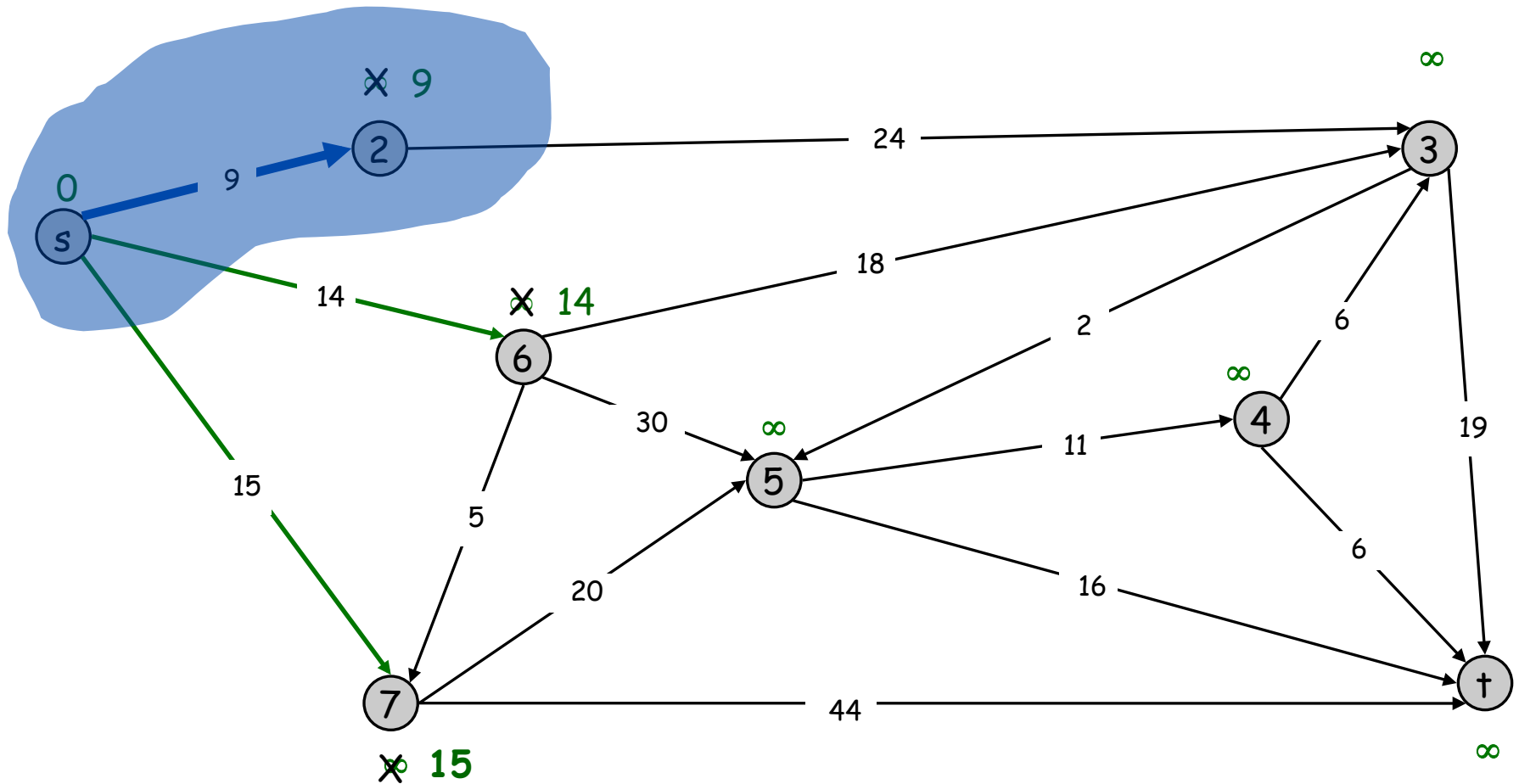
$PQ = \{2, 3, 4, 5, 6, 7, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2\}$

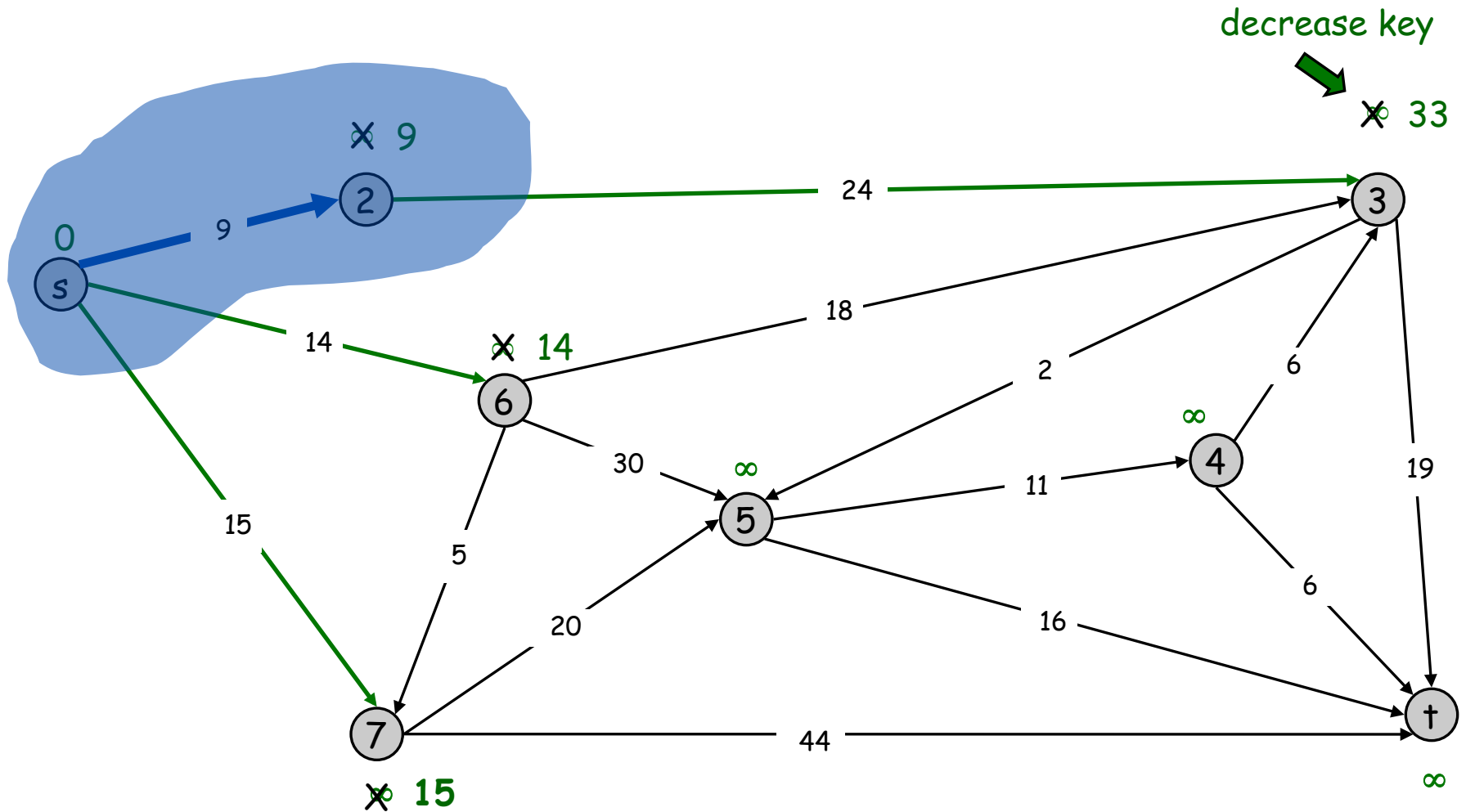
$PQ = \{3, 4, 5, 6, 7, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2\}$

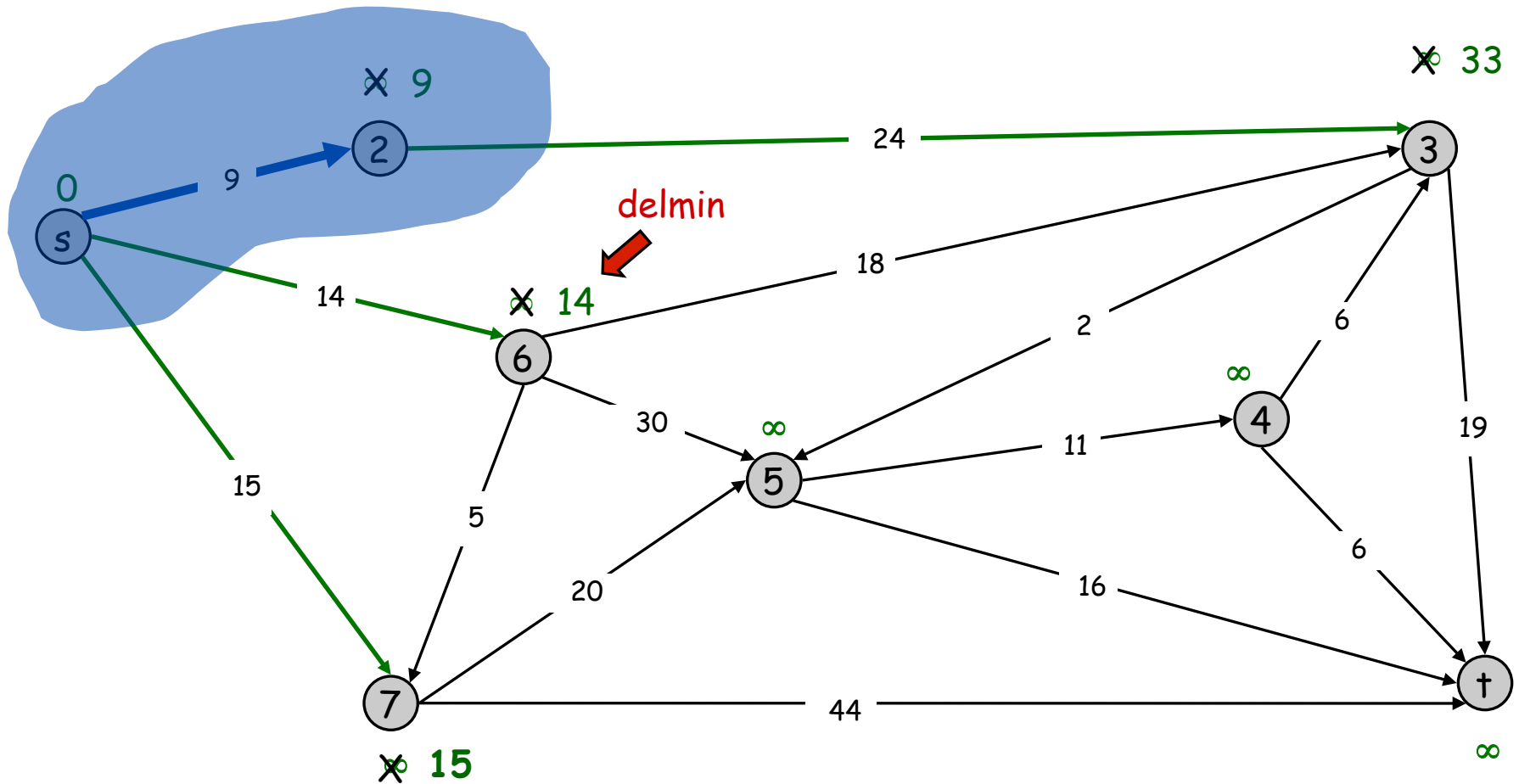
$PQ = \{3, 4, 5, 6, 7, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2\}$

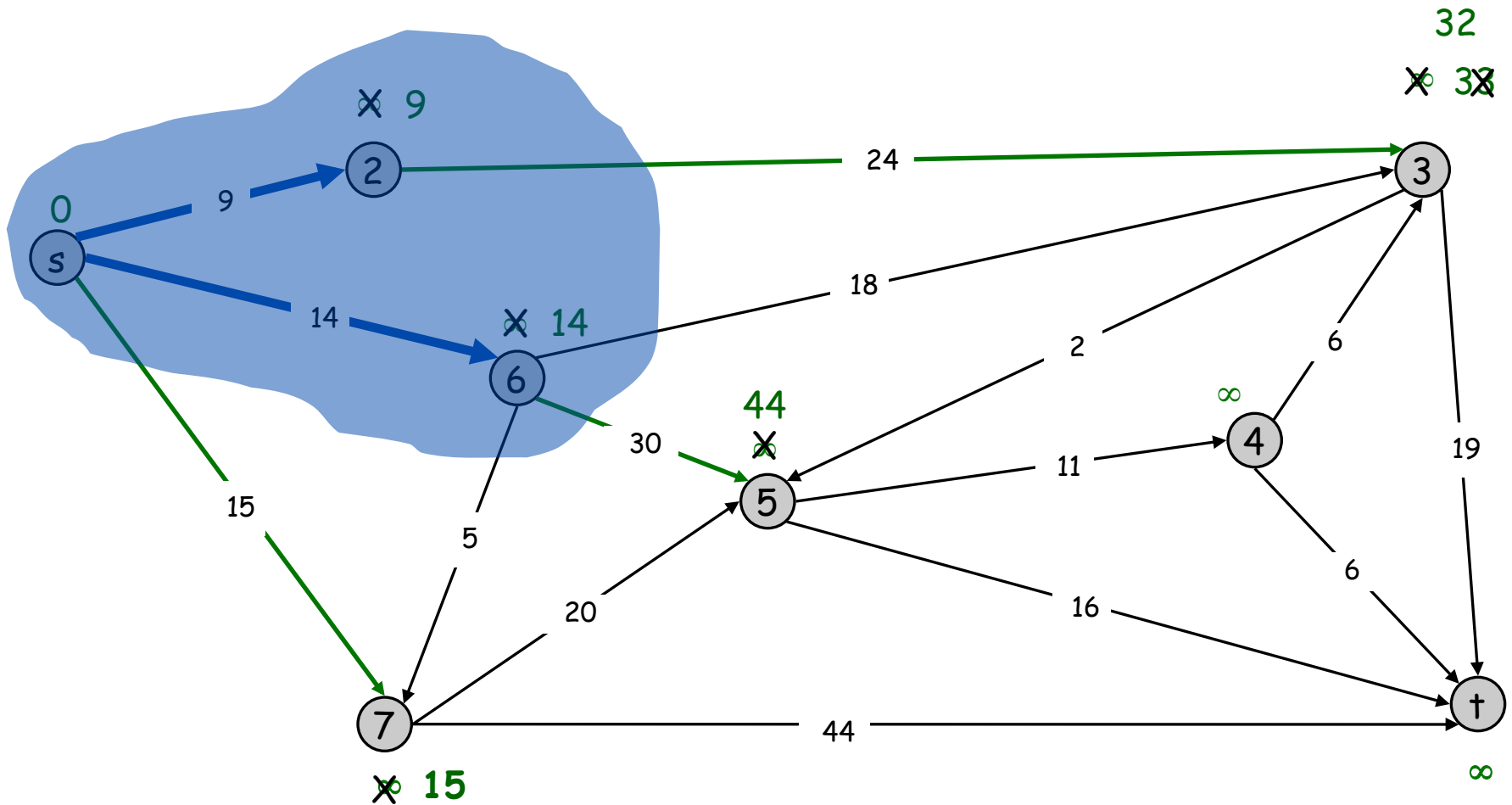
$PQ = \{3, 4, 5, 6, 7, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 6\}$

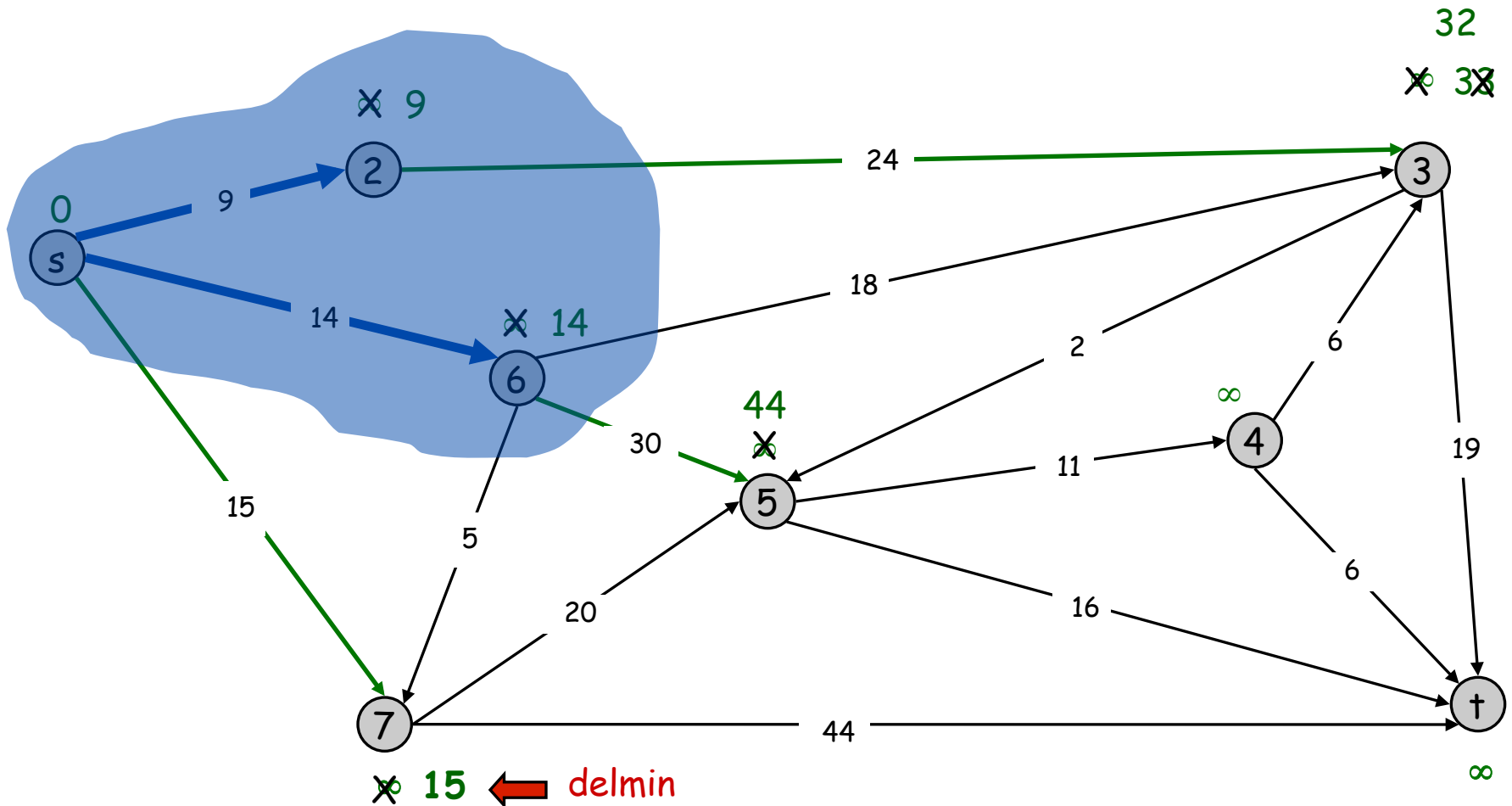
$PQ = \{3, 4, 5, 7, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 6\}$

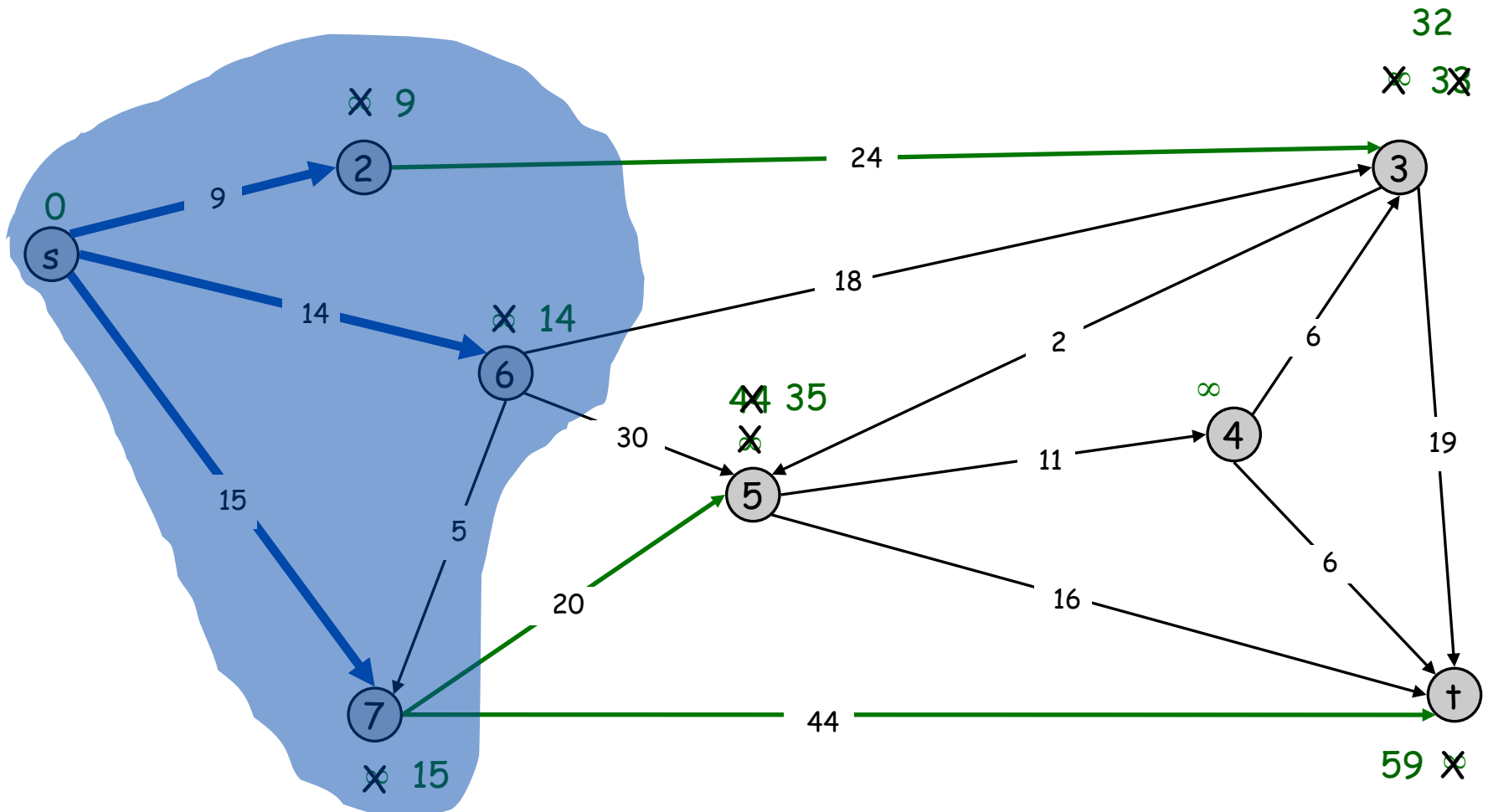
$PQ = \{3, 4, 5, 7, t\}$



Dijkstra's Shortest Path Algorithm

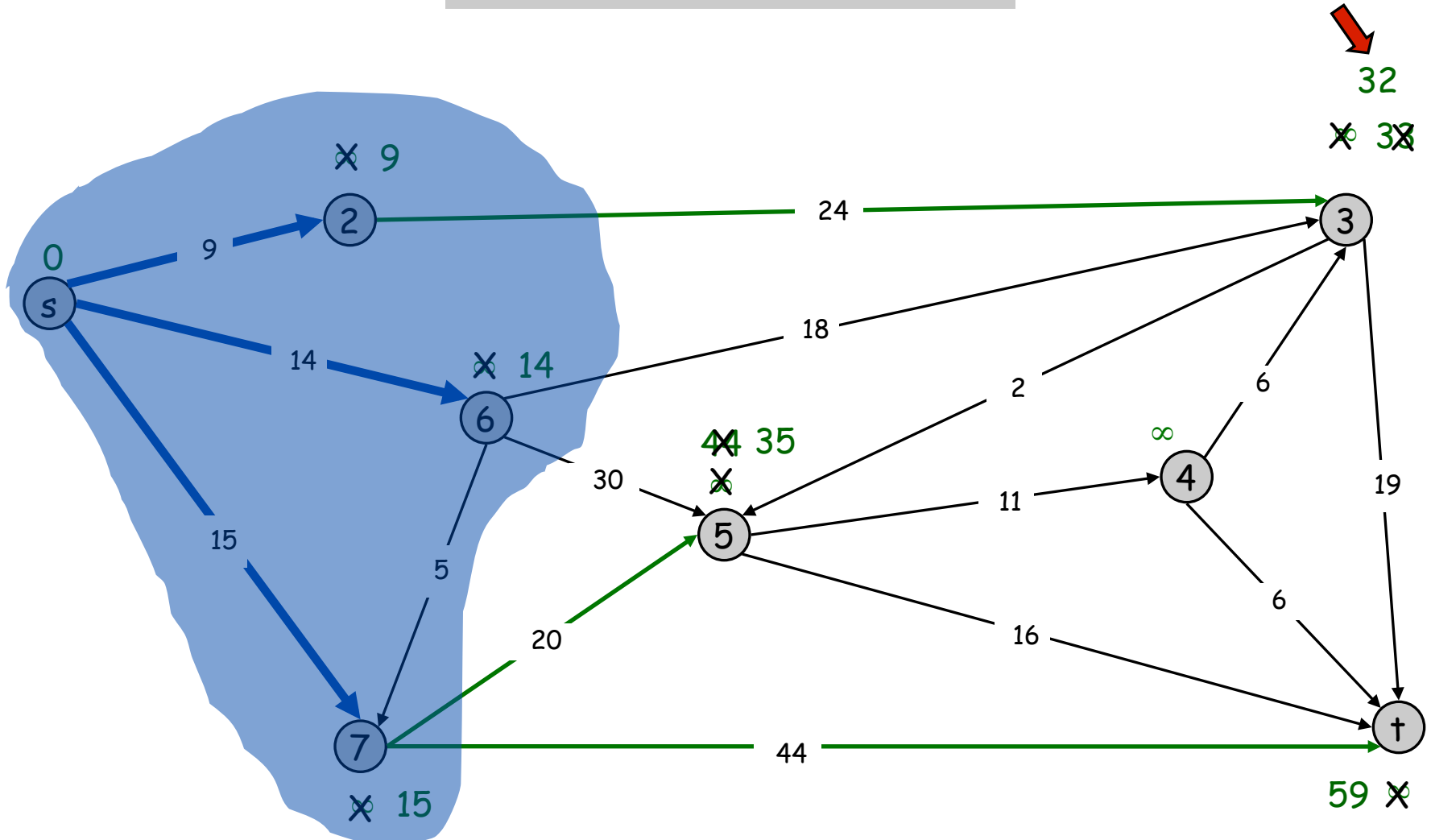
$S = \{s, 2, 6, 7\}$

$PQ = \{3, 4, 5, \dagger\}$



Dijkstra's Shortest Path Algorithm

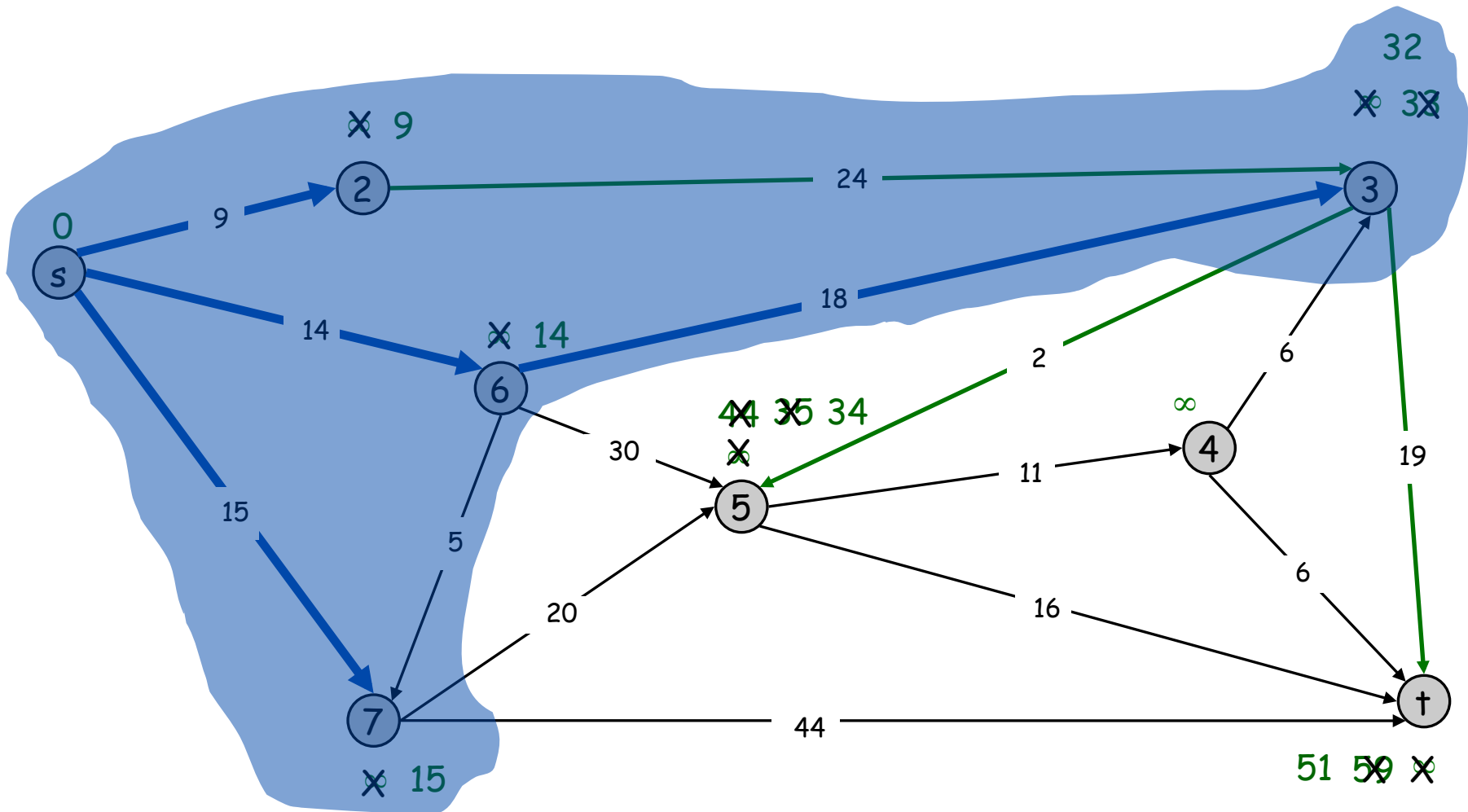
$S = \{s, 2, 6, 7\}$
 $PQ = \{3, 4, 5, \dagger\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 6, 7\}$

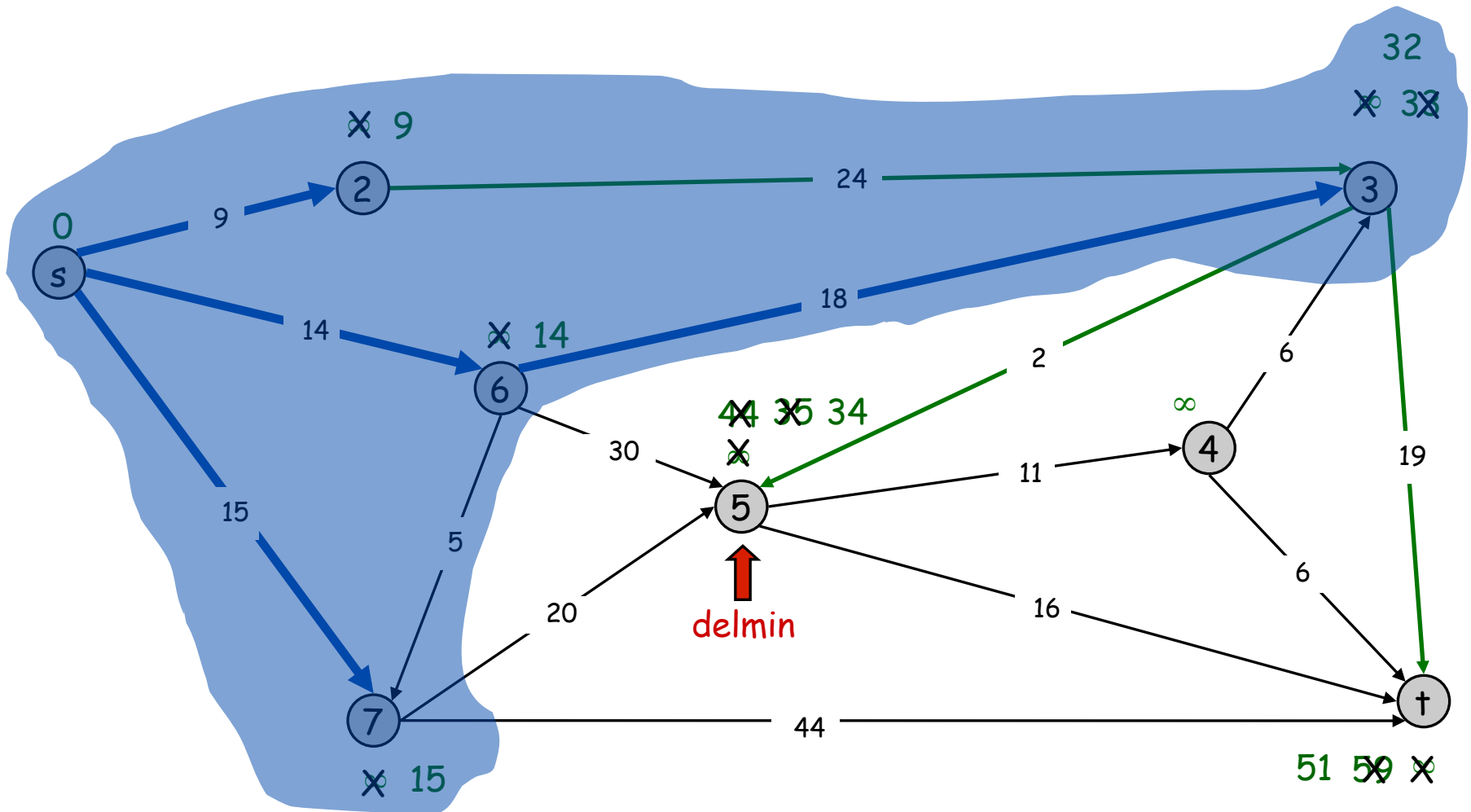
$PQ = \{4, 5, \dagger\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 6, 7\}$

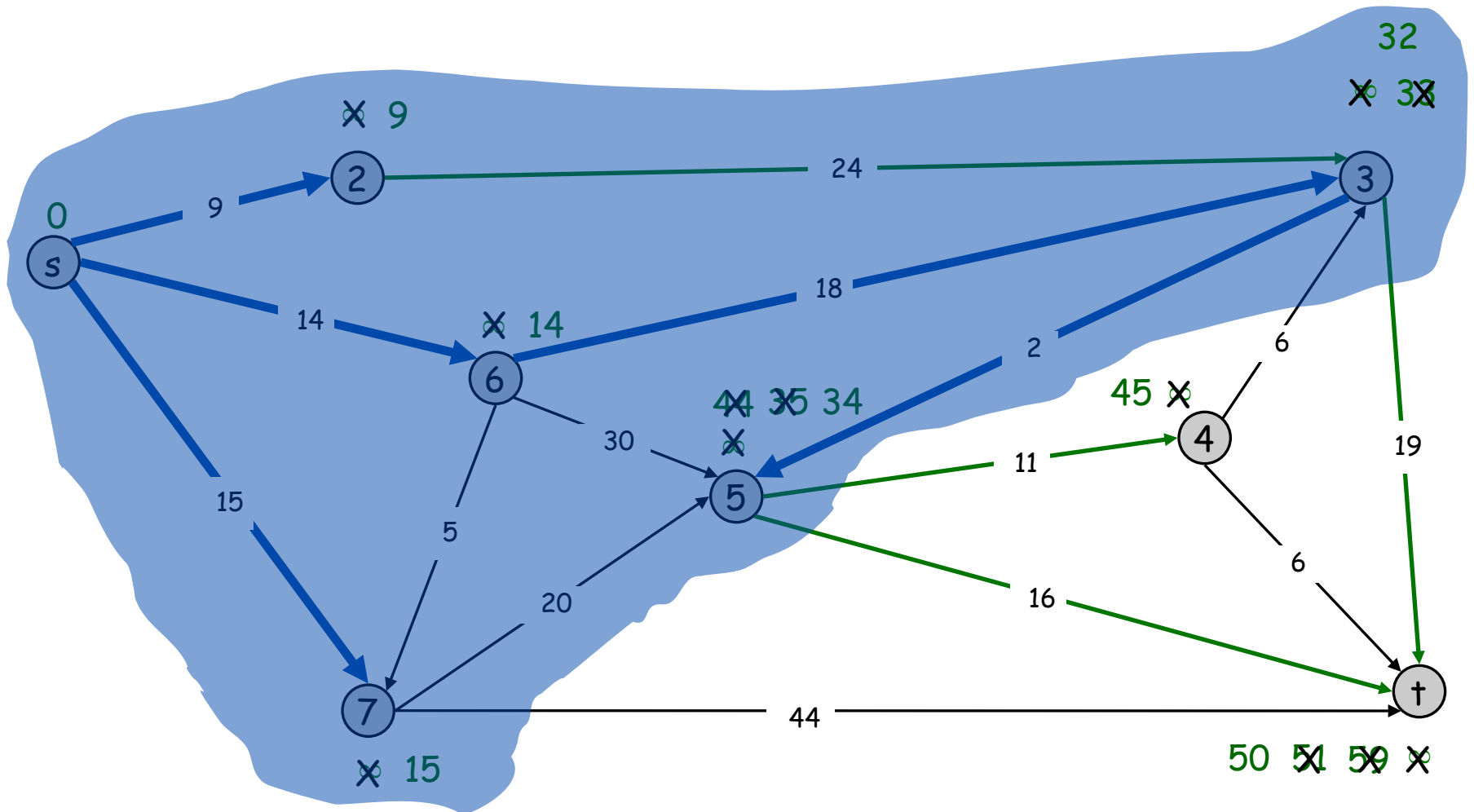
$PQ = \{4, 5, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 5, 6, 7\}$

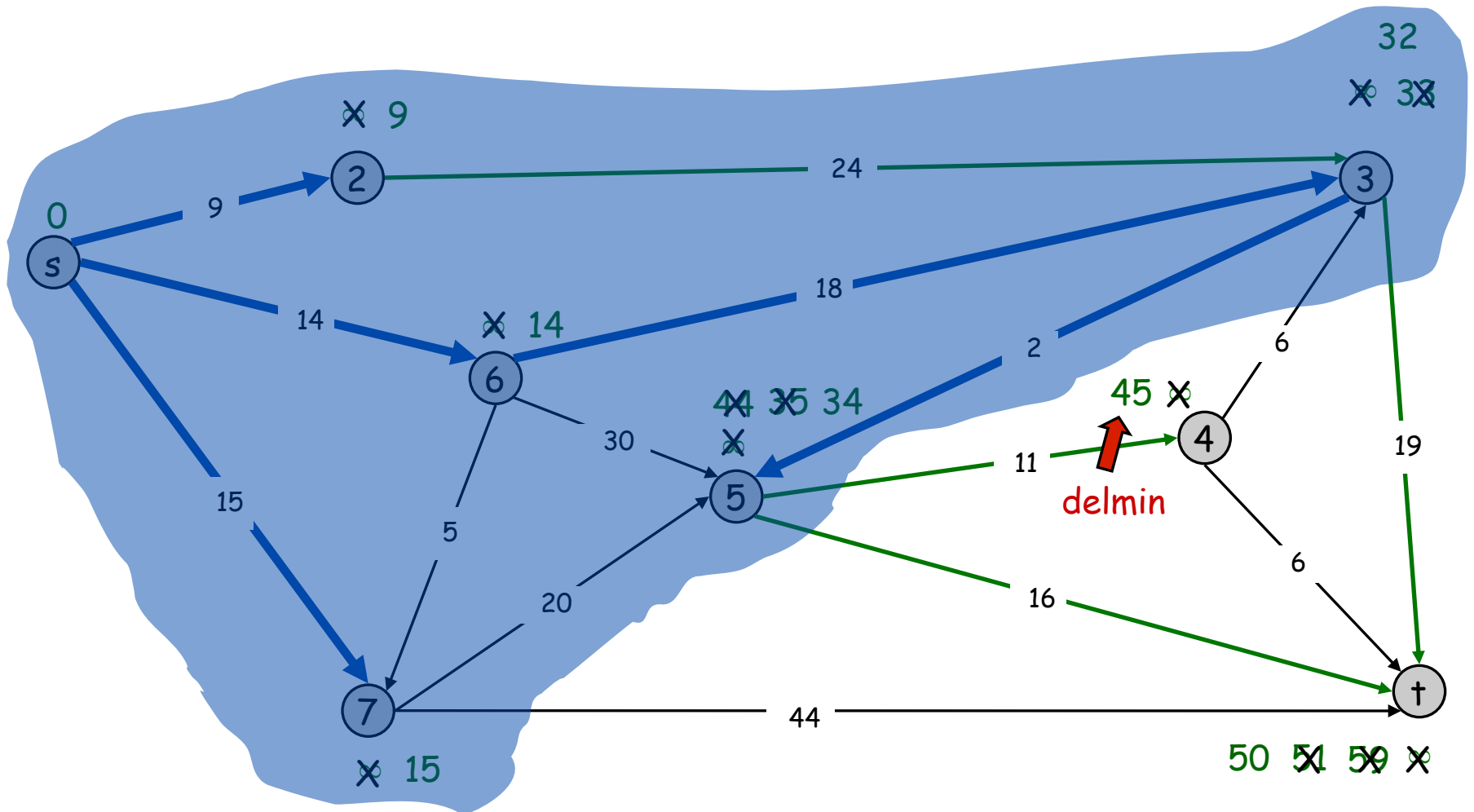
$PQ = \{4, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 5, 6, 7\}$

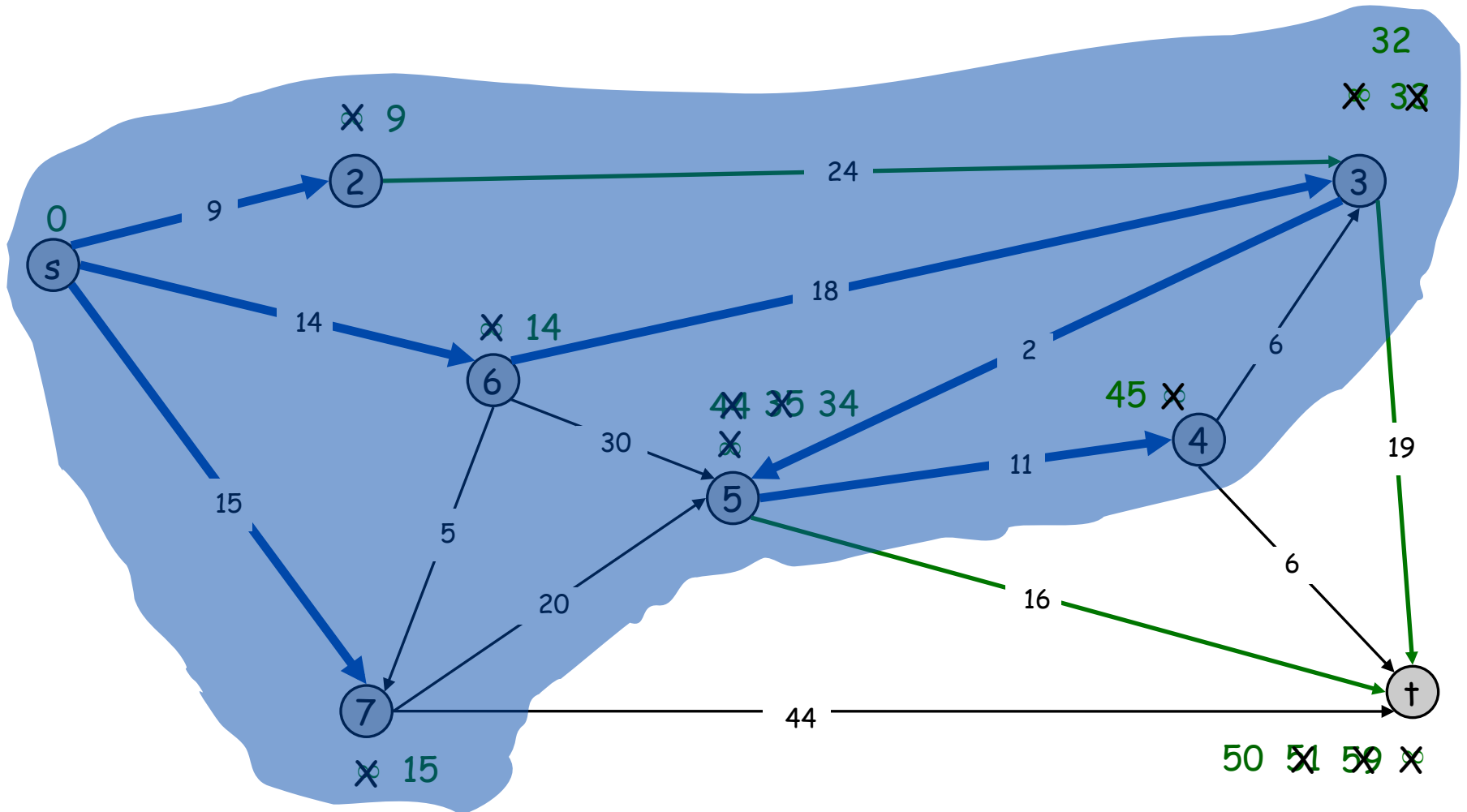
$PQ = \{4, t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 4, 5, 6, 7\}$

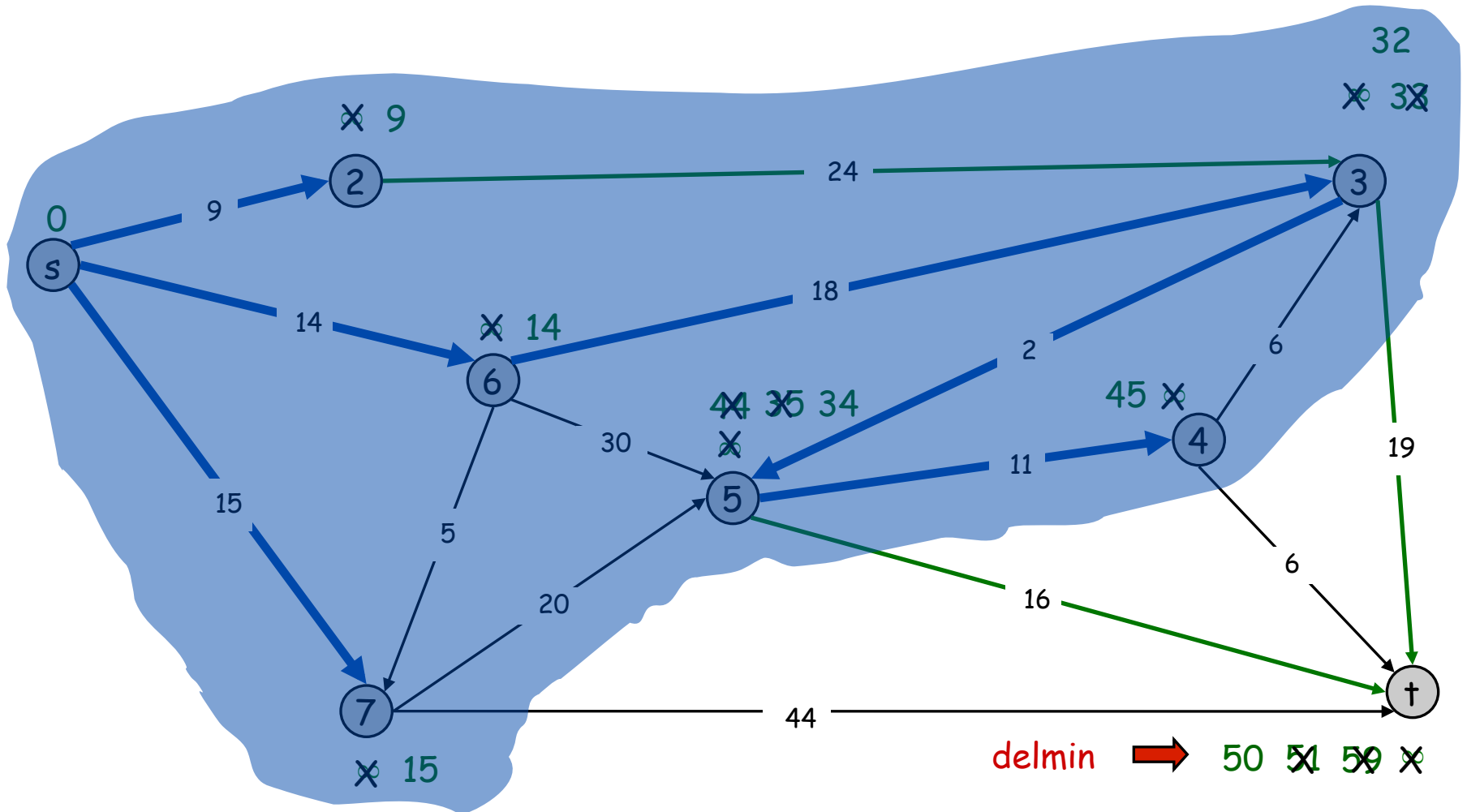
$PQ = \{t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 4, 5, 6, 7\}$

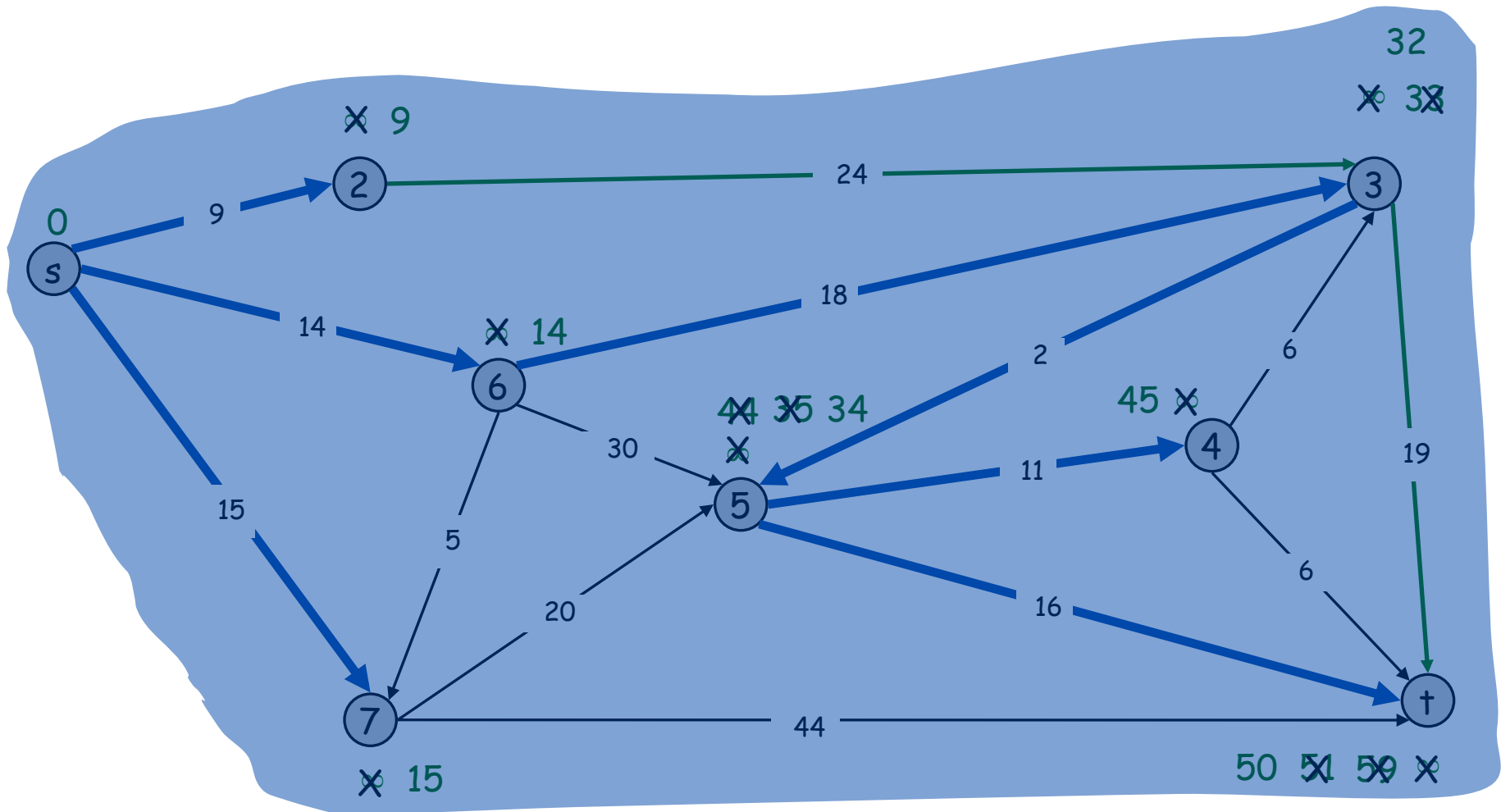
$PQ = \{t\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 4, 5, 6, 7, t\}$

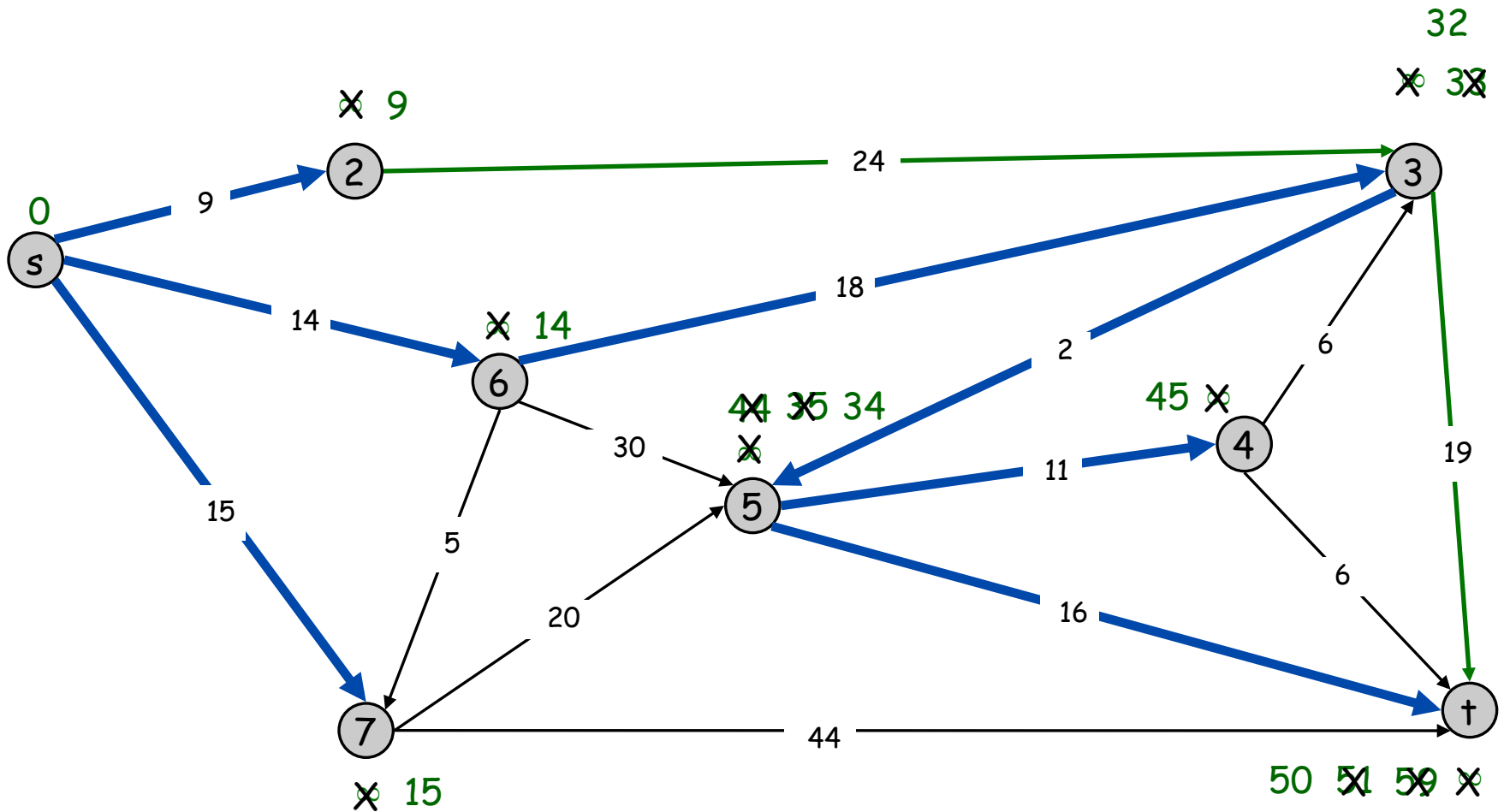
$PQ = \{\}$



Dijkstra's Shortest Path Algorithm

$S = \{s, 2, 3, 4, 5, 6, 7, t\}$

$PQ = \{\}$



Dijkstra's Algorithm: Implementation

```
procedimento Dijkstra(origem: TVertice, var G: TGrafo)
variáveis
  D: vetor[TVertice] de TPeso;
  w: TVertice;
  S, V: conjunto de TVertice;
início
  S := {origem};
  V := {todos os vértices de G};
  D[origem] := 0;
  para i:=1 até G.NumVertices faça
  início
    se i != origem e existe a aresta (origem, i) então
      D[i] := Peso da aresta (origem, i)
    senão
      D[i] := ∞;
  fim;
  enquanto S ≠ V faça
  início
    encontre um vértice  $w \in V - S$  tal que D[w] é mínimo;
    S := S ∪ {w};
    para todo v adjacente a w faça
      D[v] := min(D[v], D[w] + Peso da aresta (w,v));
  fim;
fim;
```

Dijkstra's Algorithm: Implementation

```
void dijkstra(tvertice v, tgrafo *grafo) {
    std::priority_queue<taresta> heap;
    tpeso d, peso;
    tvertice w;
    tapontador p;
    int marc[MAXNUMVERTICES];
    int i;

    for (i = 0; i < grafo->num_vertices; i++) {
        grafo->custo[i] = INFINITO;
        grafo->antecessor[i] = NULO;
        marc[i] = BRANCO;
    }
    grafo->custo[v] = 0.0;
    heap.push(cria_aresta(0.0, v));
}
```


Dijkstra's Algorithm: Implementation

```
void dijkstra(tvertice v, tgrafo *grafo) {
    std::priority_queue<taresta> heap;
    tpeso d, peso;
    tvertice w;
    tapontador p;
    int marc[MAXNUMVERTICES];
    int i;

    for (i = 0; i < grafo->num_vertices; i++) {
        grafo->custo[i] = INFINITO;
        grafo->antecessor[i] = NULO;
        marc[i] = BRANCO;
    }
    grafo->custo[v] = 0.0;
    heap.push(cria_aresta(0.0, v));
}
```

Dijkstra's Algorithm: Implementation

```
void dijkstra(tvertice v, tgrafo *grafo) {
    std::priority_queue<taresta> heap;
    tpeso cria_aresta(tpeso peso, tvertice dest) {
        tvertice origem = v;
        taresta aresta;
        aresta.origem = origem;
        aresta.dest = dest;
        aresta.peso = peso;
        return aresta;
    }
    for (int i = 0; i < grafo->custo.size(); i++)
        grafo->custo[i] = INFINITO;
    grafo->antecessor[i] = NULO;
    marc[i] = BRANCO;
}
grafo->custo[v] = 0.0;
heap.push(cria_aresta(0.0, v));
```

Dijkstra's Algorithm: Implementation

```
while (!heap.empty()) {
    v = heap.top().dest; heap.pop();
    if (marc[v] == PRETO) continue;
    marc[v] = PRETO;
    p = primeiro_adj(v, grafo);
    while (p != NULO) {
        recupera_adj(v, p, &w, &peso, grafo);
        d = grafo->custo[v] + peso;
        if (cmp(d, grafo->custo[w]) < 0) {
            grafo->custo[w] = d;
            heap.push(cria_aresta(d, w));
            grafo->antecessor[w] = v;
        }
        p = proximo_adj(v, p, grafo);
    }
}
```

Dijkstra's Algorithm: Implementation

```
while (!heap.empty()) {  
    v = heap.top().dest; heap.pop();  
    if (marc[v] == PRETO) continue;  
    marc[v] = PRETO;  
    p = primeiro_adj(v, grafo);  
    while (p != NULO) {  
        recupera_adj(v, p, &w, &peso, grafo);  
        d = grafo->custo[v] + peso;  
        if (cmp(d, grafo->custo[w]) < 0) {  
            grafo->custo[w] = d;  
        }  
    }  
}
```

```
int cmp(double x, double y = 0, double tol = DBL_EPSILON) {  
    return (x <= y + tol) ? (x + tol < y) ? -1 : 0 : 1;  
}
```

```
}
```

```
}
```

```
}
```

Dijkstra's Algorithm: Implementation

For each unexplored node, explicitly maintain $\pi(v) = \min_{e=(u,v): u \in S} d(u) + \ell_e$.

- Next node to explore = node with minimum $\pi(v)$.
- When exploring v , for each incident edge $e = (v, w)$, update $\pi(w) = \min \{ \pi(w), \pi(v) + \ell_e \}$.

Efficient implementation. Maintain a priority queue of unexplored nodes, prioritized by $\pi(v)$.



PQ Operation	Dijkstra	Array	Binary heap	d-way Heap	Fib heap †
Insert	n	n	$\log n$	$d \log_d n$	1
ExtractMin	n	n	$\log n$	$d \log_d n$	$\log n$
ChangeKey	m	1	$\log n$	$\log_d n$	1
IsEmpty	n	1	1	1	1
Total		n^2	$m \log n$	$m \log_{m/n} n$	$m + n \log n$

† Individual ops are amortized bounds