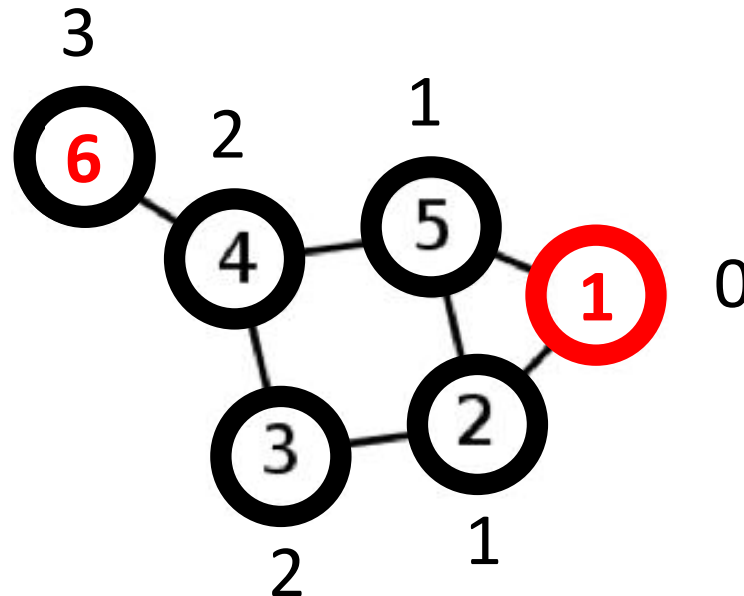


# Introdução à Teoria dos Grafos

Prof. Alexandre Noma

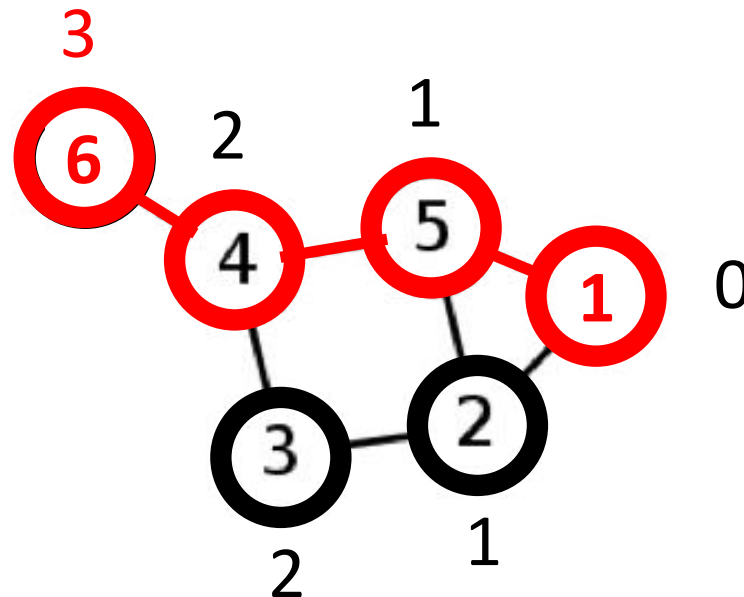
# Semana passada...

- Caminho mínimo
  - É um caminho de comprimento mínimo.
- Ex. qual seria um caminho mínimo de 1 até 6?



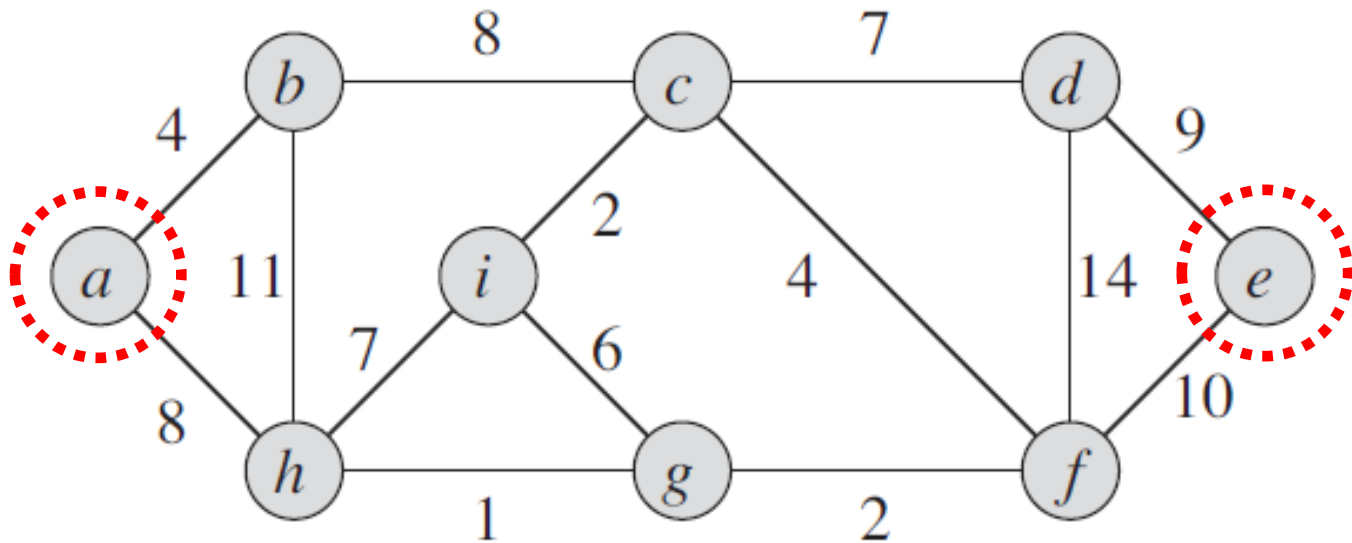
# Semana passada...

- Caminho mínimo
  - É um caminho de comprimento mínimo.
- Ex. qual seria um caminho mínimo de 1 até 6?



# Hoje

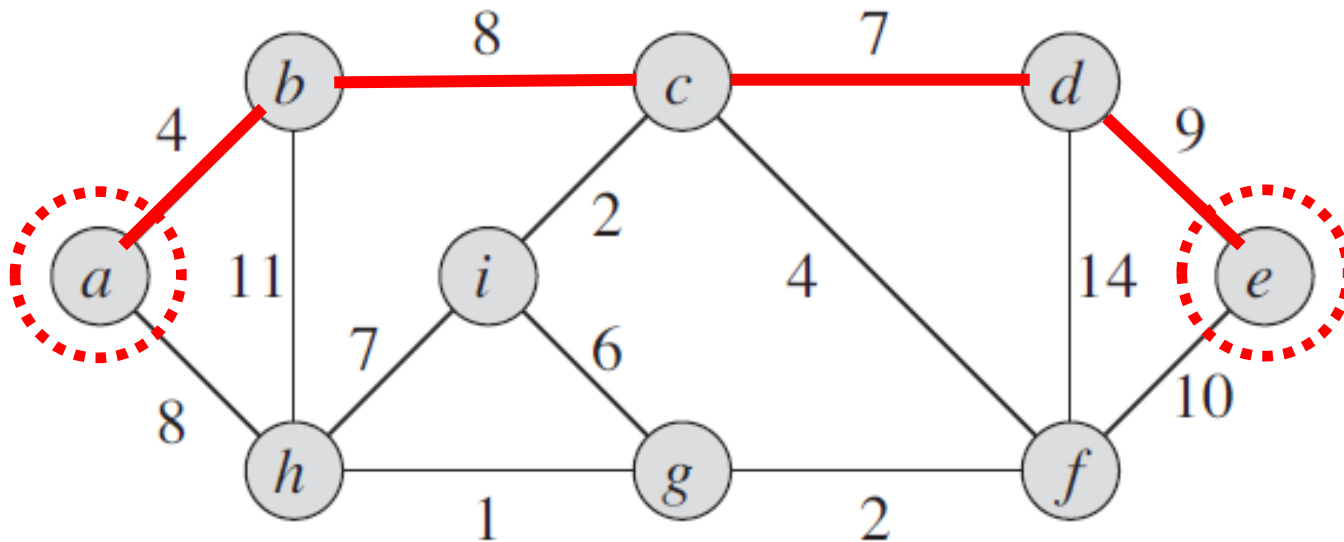
- Calcule um **caminho mínimo** de **a** até **e**?



# Hoje

- Calcule um **caminho mínimo** de **a** até **e**?

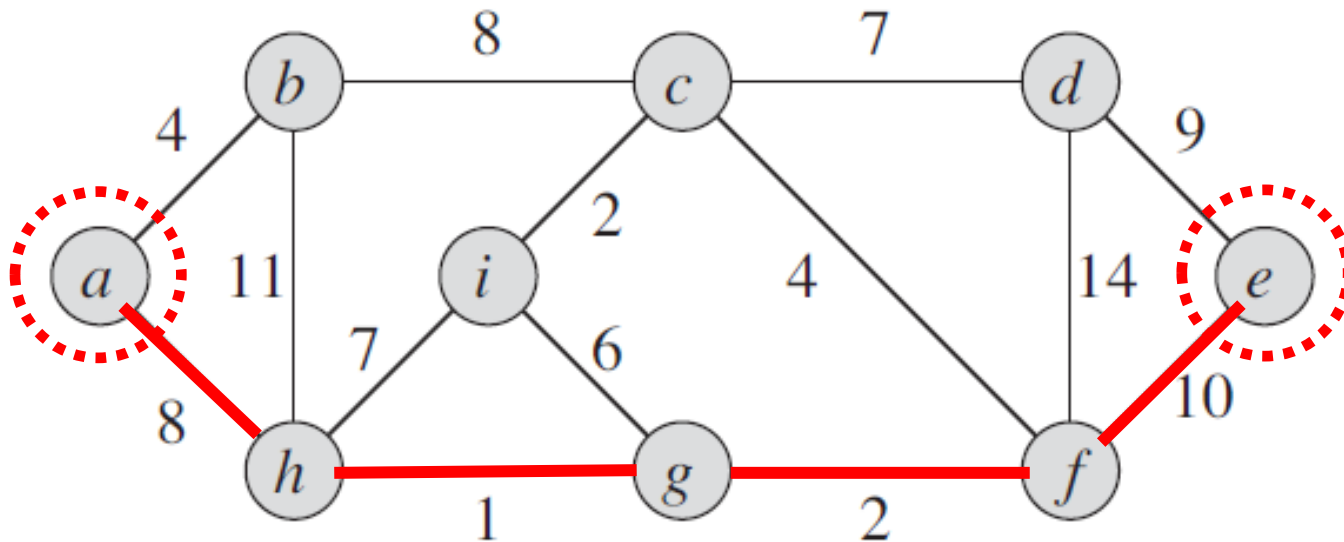
$|P_1| = 4 + 8 + 7 + 9 = 28$  é mínimo?



# Hoje

- Calcule um **caminho mínimo** de **a** até **e**?

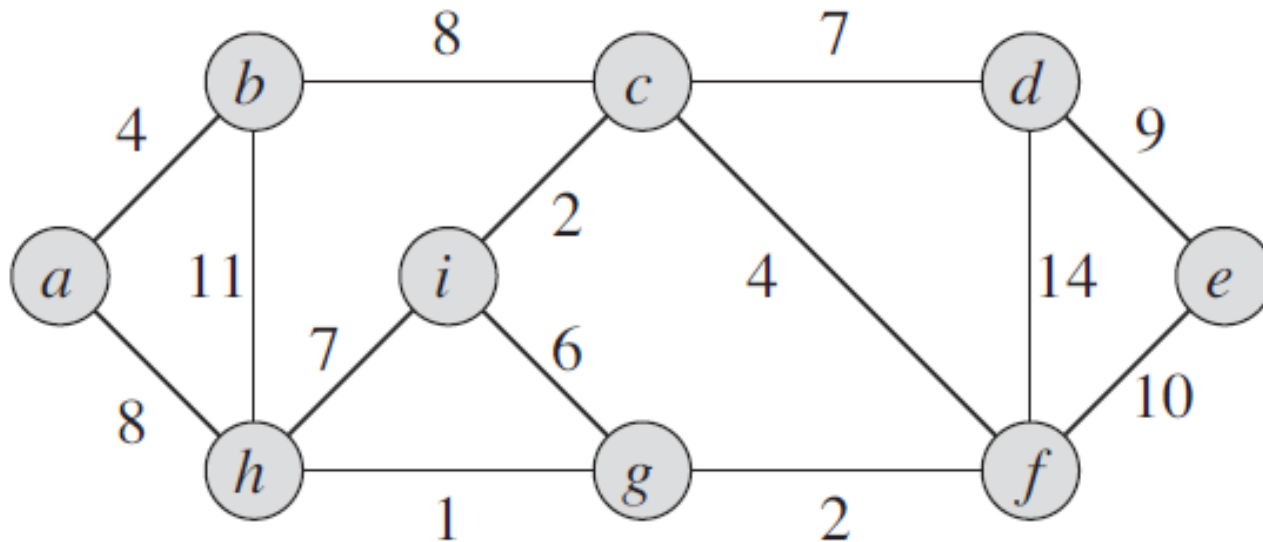
$|P_1| = 4 + 8 + 7 + 9 = 28$  não é mínimo!



$|P_2| = 8 + 1 + 2 + 10 = 21$  é mínimo?

# Grafo ponderado

- É um grafo com **pesos** nas arestas.
- Como representar no computador?

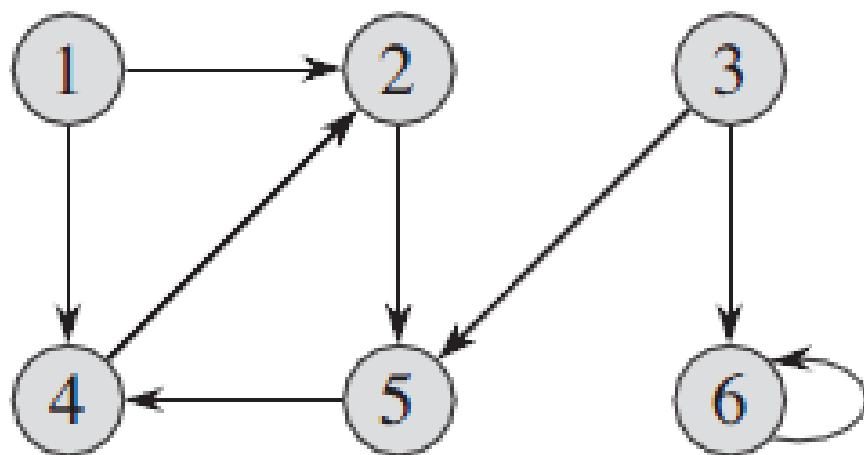


# Aulas passadas

- Representar um grafo no computador:
- (1) **Matriz** de adjacências
- (2) **Listas** de adjacências

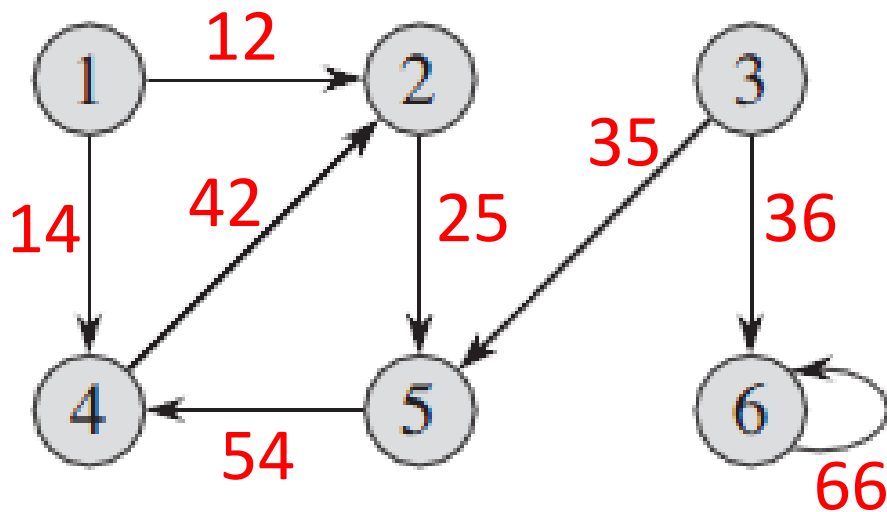


# 1. Matriz de Adjacências



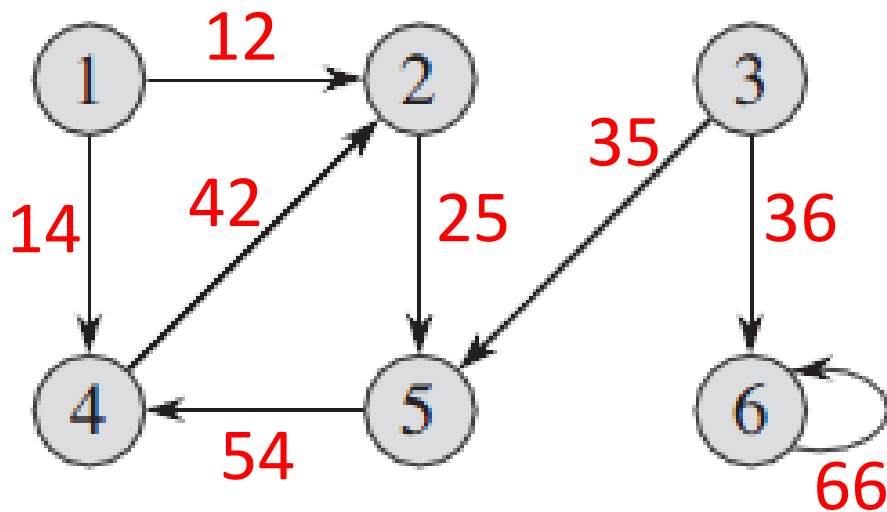
	1	2	3	4	5	6
1	0	1	0	1	0	0
2	0	0	0	0	1	0
3	0	0	0	0	1	1
4	0	1	0	0	0	0
5	0	0	0	1	0	0
6	0	0	0	0	0	1

# 1. Matriz de Adjacências?



	1	2	3	4	5	6
1	0	?	0	?	0	0
2	0	0	0	0	?	0
3	0	0	0	0	?	?
4	0	?	0	0	0	0
5	0	0	0	?	0	0
6	0	0	0	0	0	?

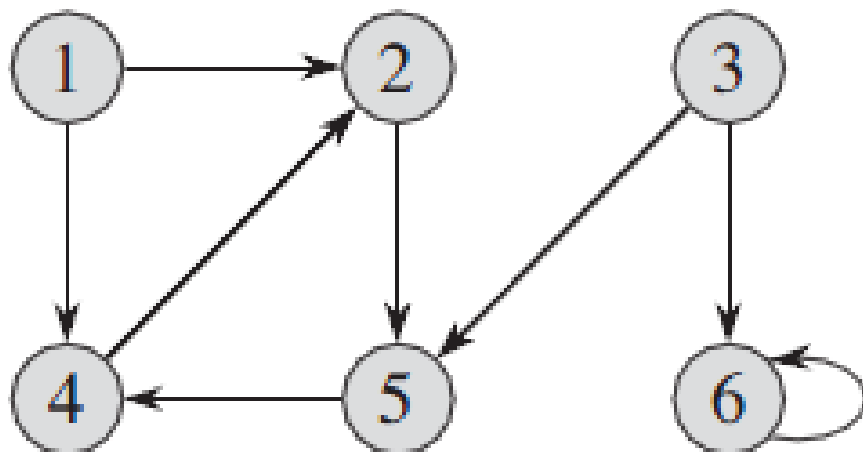
# 1. Matriz de Adjacências?



	1	2	3	4	5	6
1	0	12	0	14	0	0
2	0	0	0	0	25	0
3	0	0	0	0	35	36
4	0	42	0	0	0	0
5	0	0	0	54	0	0
6	0	0	0	0	0	66

## 2. Listas de Adjacências

### (2) Listas de adjacências



**1:** 2, 4

**2:** 5

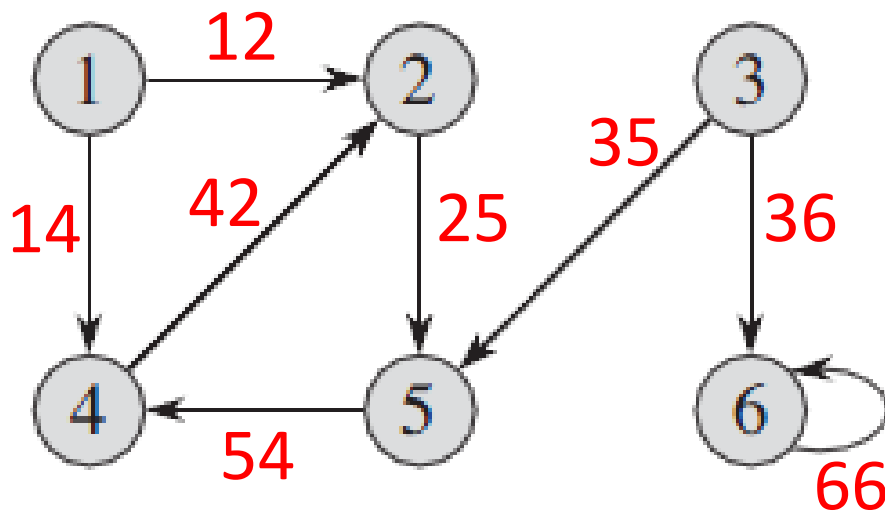
**3:** 5, 6

**4:** 2

**5:** 4

**6:** 6

## 2. Listas de Adjacências?



**1:** ?, ?

**2:** ?

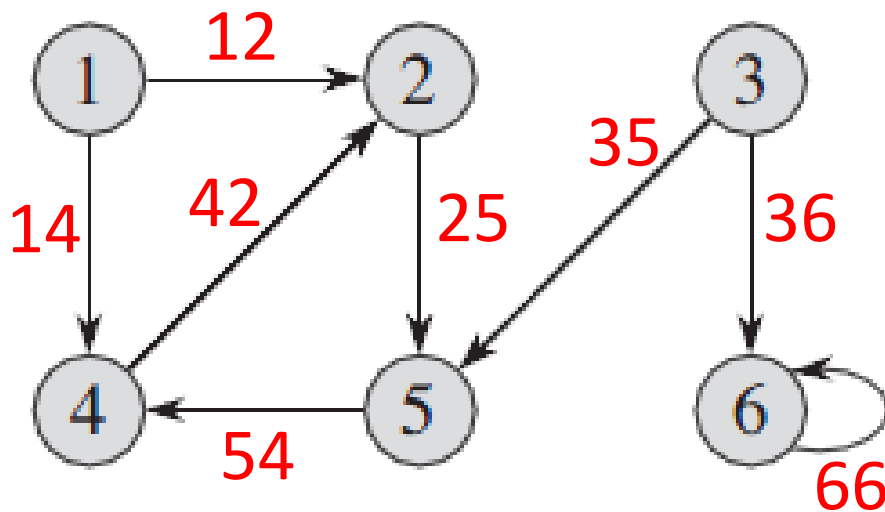
**3:** ?, ?

**4:** ?

**5:** ?

**6:** ?

## 2. Listas de Adjacências?



**1:** 2 (12), 4 (14)

**2:** 5 (25)

**3:** 5 (35), 6 (36)

**4:** 2 (42)

**5:** 4 (54)

**6:** 6 (66)

# Exercício Programa

- 08-leGrafoPonderado.py

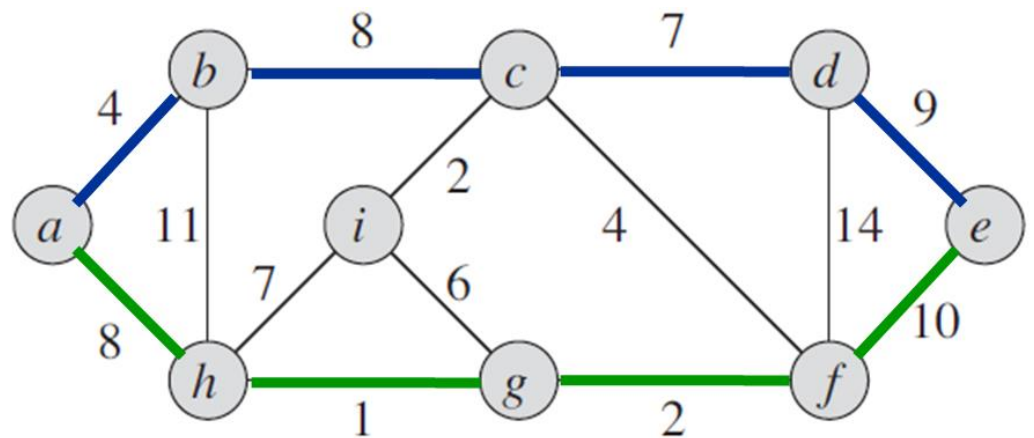
# Hoje

- Algoritmo de **Dijkstra**  
(caminhos mínimos para grafos **ponderados**)
- Pré-requisitos:
  - **Definições:** caminho, comprimento, caminho mínimo, distância
  - Fila de **prioridade**



# Definições

- Caminho
- Comprimento
- Caminho mínimo
- Distância



# Fila de **prioridade**?



# Fila de **prioridade**

- **Inserir(Q, x)**
  - insere elemento x no conjunto Q
- **Mínimo(Q)**
  - devolve o elemento de Q com a **menor chave**
- **ExtraiMínimo(Q)**
  - remove e devolve o elemento de Q com a **menor chave**
- **Vazio(Q)**
  - devolve verdadeiro se fila vazia, falso caso contrário

# Fila de prioridade

- Exemplo

100	20	12	30	14
-----	----	----	----	----

ExtraiMínimo: ?

# Fila de prioridade

- Exemplo

100	20	<del>12</del>	30	14
-----	----	---------------	----	----

ExtraiMínimo: 12

# Fila de prioridade

- Exemplo

100	20	<del>12</del>	30	14
-----	----	---------------	----	----

ExtraiMínimo: ?

# Fila de prioridade

- Exemplo

100	20	<del>12</del>	30	<del>14</del>
-----	----	---------------	----	---------------

ExtraiMínimo: 14

# Fila de prioridade

- Exemplo

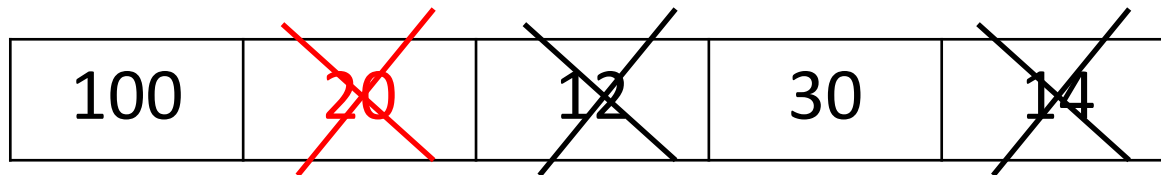
100	20	<del>12</del>	30	<del>14</del>
-----	----	---------------	----	---------------

ExtraiMínimo: ?



# Fila de prioridade

- Exemplo



ExtraiMínimo: 20

# Exercício Programa

- 09-filaDePrioridade.py  
(implementação simples e ineficiente com **vetor de índices**)
- Ex. Implementação eficiente com **HEAP**

# Algoritmo de Dijkstra

- **Dijkstra**( $G, w, s$ )
  - **Entrada**: um grafo  **$G$** , ponderado com pesos  **$w$** , e um vértice inicial  **$s$**
  - **Saída**: **distâncias** em relação ao vértice inicial (e **caminhos mínimos**)
- **Atributos**
  - $v.d$ : distância
  - $v.\Pi$  ( **$v.pai$** )
    - ("**árvore** de caminhos mínimos")

# Dijkstra

DIJKSTRA( $G, w, s$ )

```
1  INITIALIZE-SINGLE-SOURCE( $G, s$ )
2   $Q = G.V$ 
3  while  $Q \neq \emptyset$ 
4       $u = \text{EXTRACT-MIN}(Q)$ 
5      for each vertex  $v \in G.Adj[u]$ 
6          RELAX( $u, v, w$ )
```

# Dijkstra

DIJKSTRA( $G, w, s$ )

```
1  INITIALIZE-SINGLE-SOURCE( $G, s$ )
2   $Q = G.V$ 
3  while  $Q \neq \emptyset$ 
4       $u = \text{EXTRACT-MIN}(Q)$ 
5      for each vertex  $v \in G.\text{Adj}[u]$ 
6          RELAX( $u, v, w$ )
```

# Dijkstra

INITIALIZE-SINGLE-SOURCE( $G, s$ )

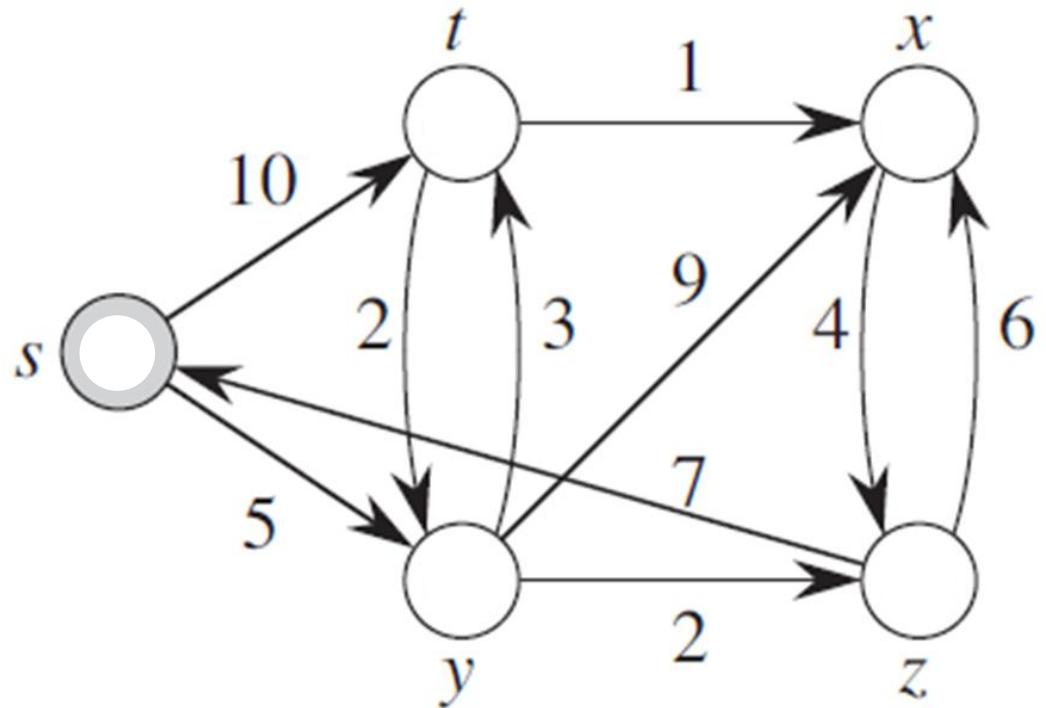
```
1  for each vertex  $v \in G.V$ 
2       $v.d = \infty$ 
3       $v.\pi = \text{NIL}$ 
4   $s.d = 0$ 
```

RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$ 
2       $v.d = u.d + w(u, v)$ 
3       $v.\pi = u$ 
```

# Dijkstra

- Exemplo



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

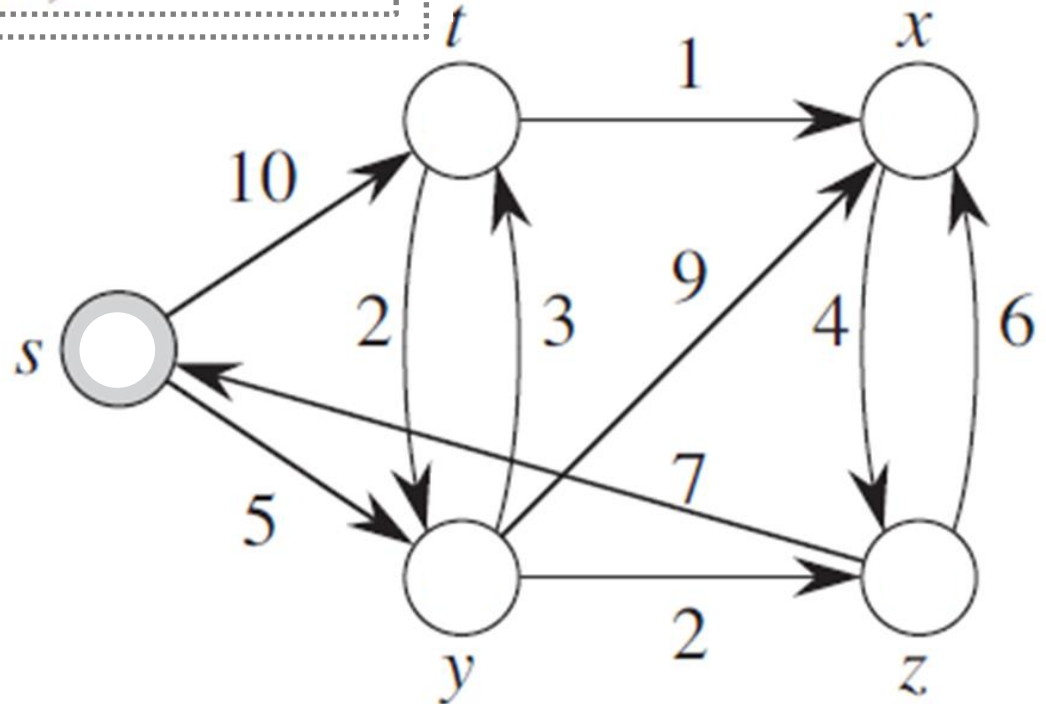
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )





DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

2  $Q = G.V$

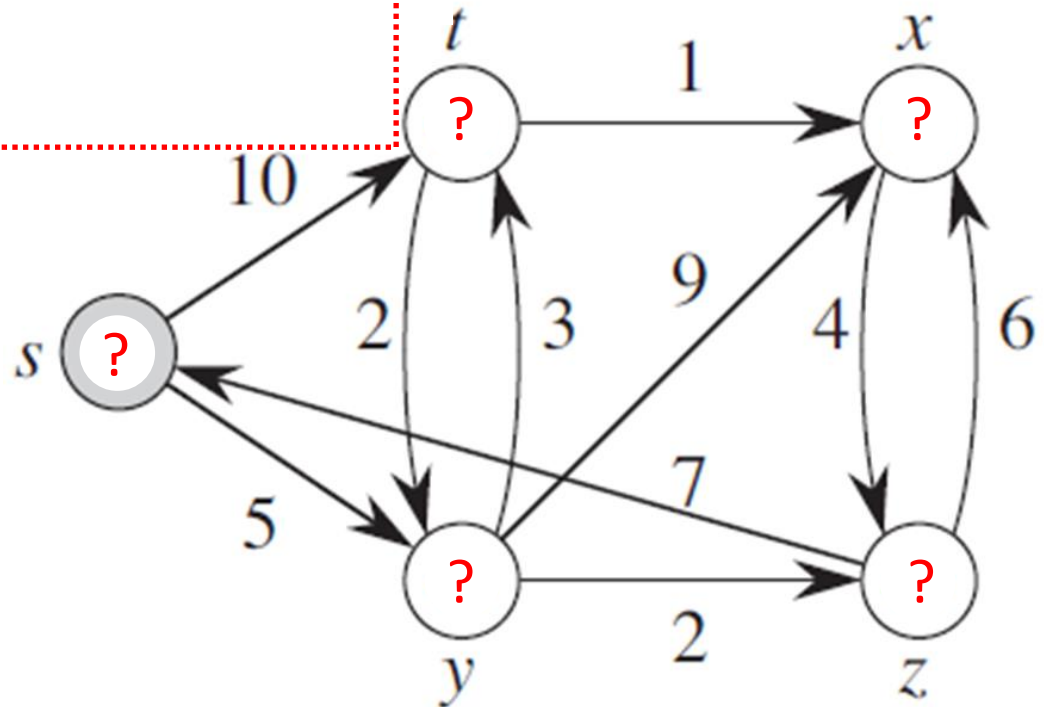
INITIALIZE-SINGLE-SOURCE( $G, s$ )

1 **for** each vertex  $v \in G.V$

2      $v.d = \infty$

3      $v.\pi = \text{NIL}$

4      $s.d = 0$



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

2  $Q = G.V$

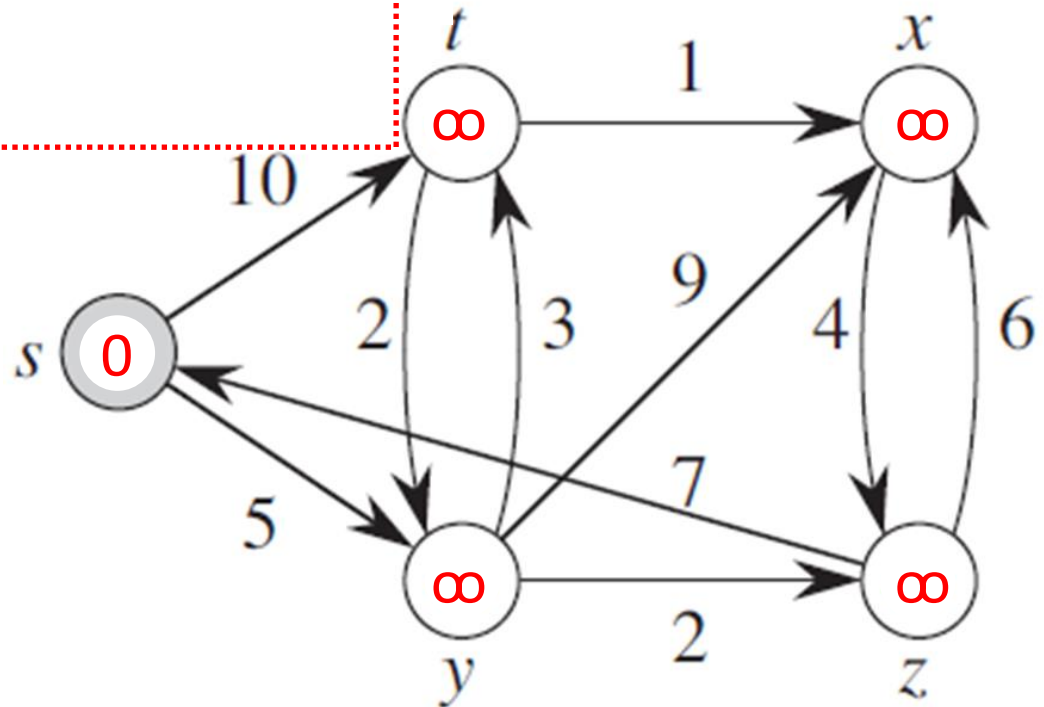
INITIALIZE-SINGLE-SOURCE( $G, s$ )

1 **for** each vertex  $v \in G.V$

2      $v.d = \infty$

3      $v.\pi = \text{NIL}$

4      $s.d = 0$



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

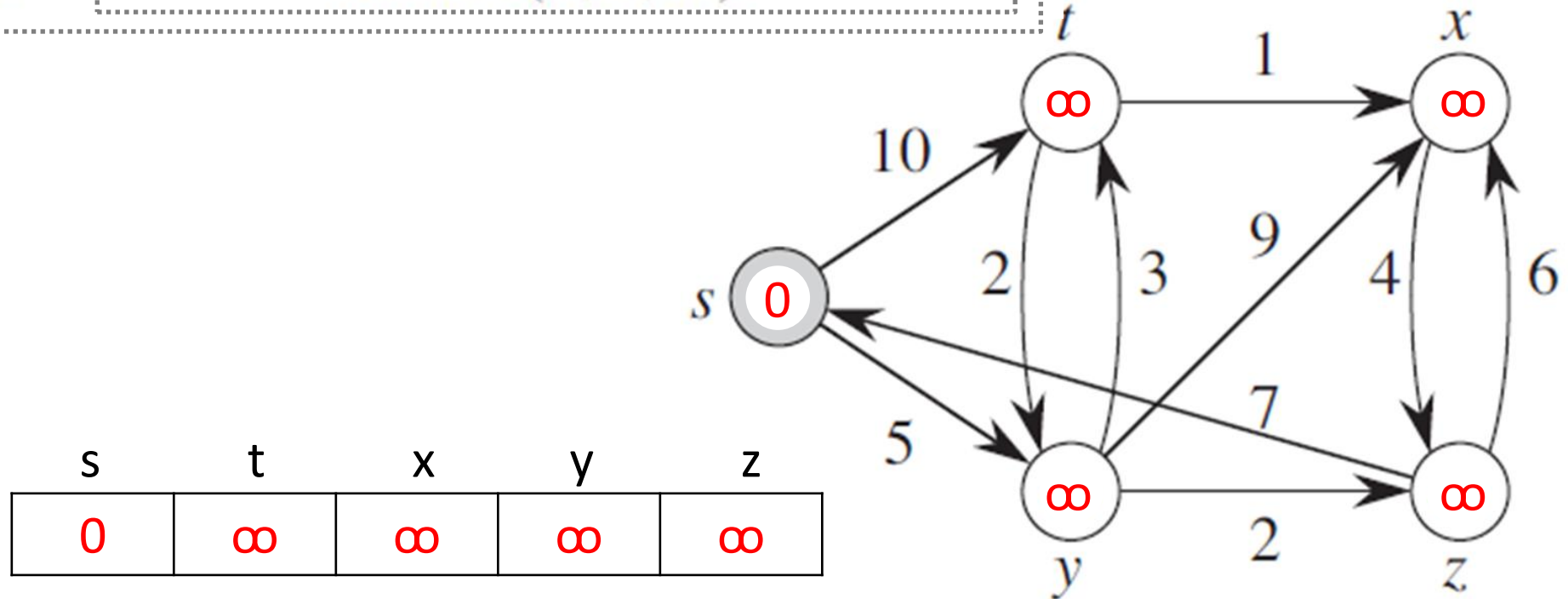
2  $Q = G.V$

3 while  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     for each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

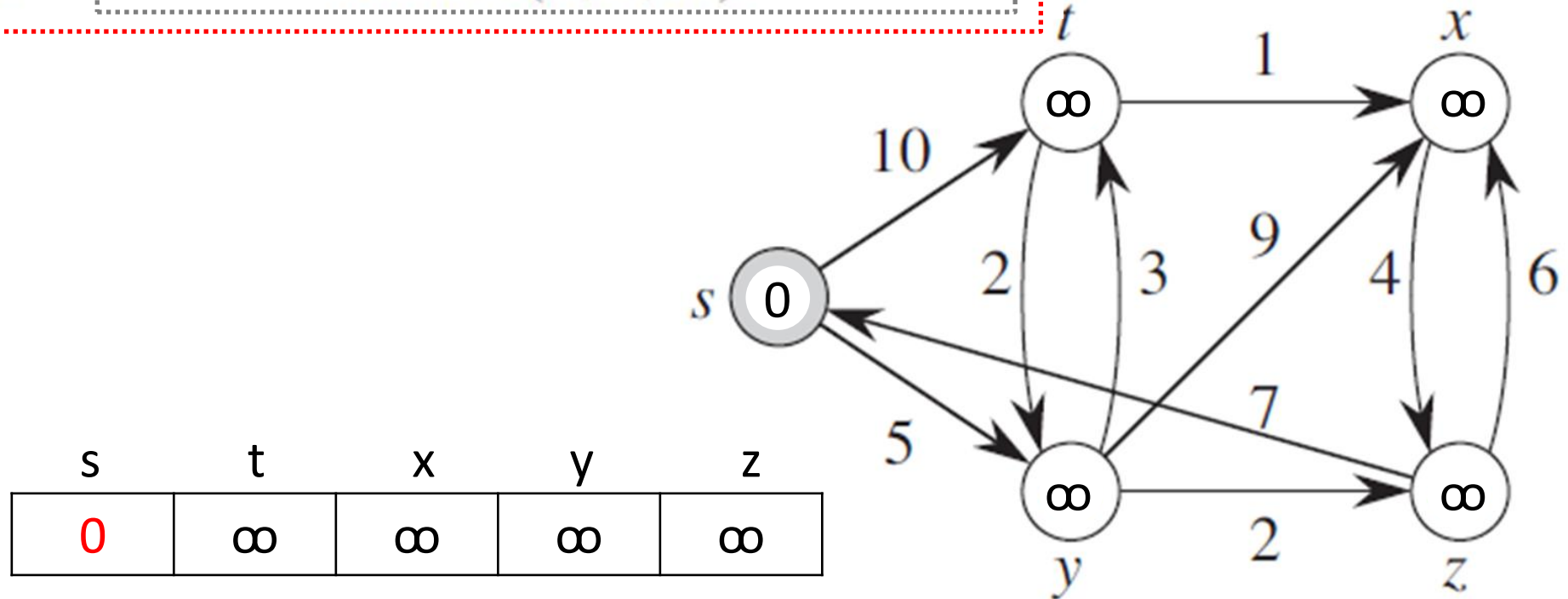
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

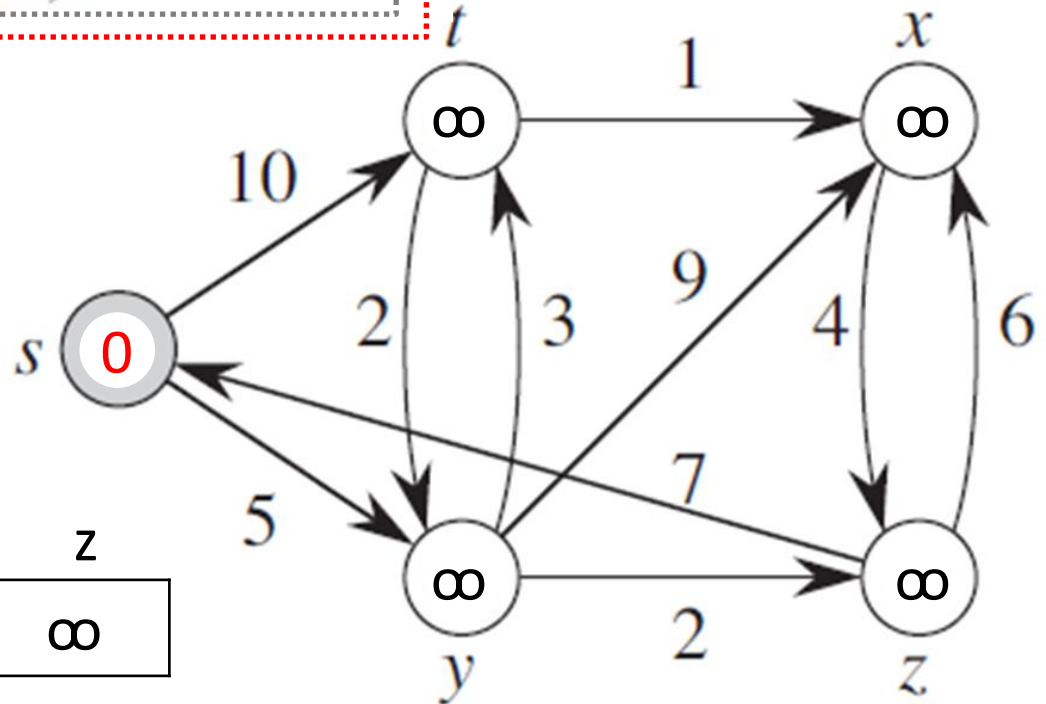
2  $Q = G.V$

3 while  $Q \neq \emptyset$

4  $u = \text{EXTRACT-MIN}(Q)$

5 for each vertex  $v \in G.\text{Adj}[u]$

6 RELAX( $u, v, w$ )



<del>s</del>	t	x	y	z
<del><math>\infty</math></del>	$\infty$	$\infty$	$\infty$	$\infty$

DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

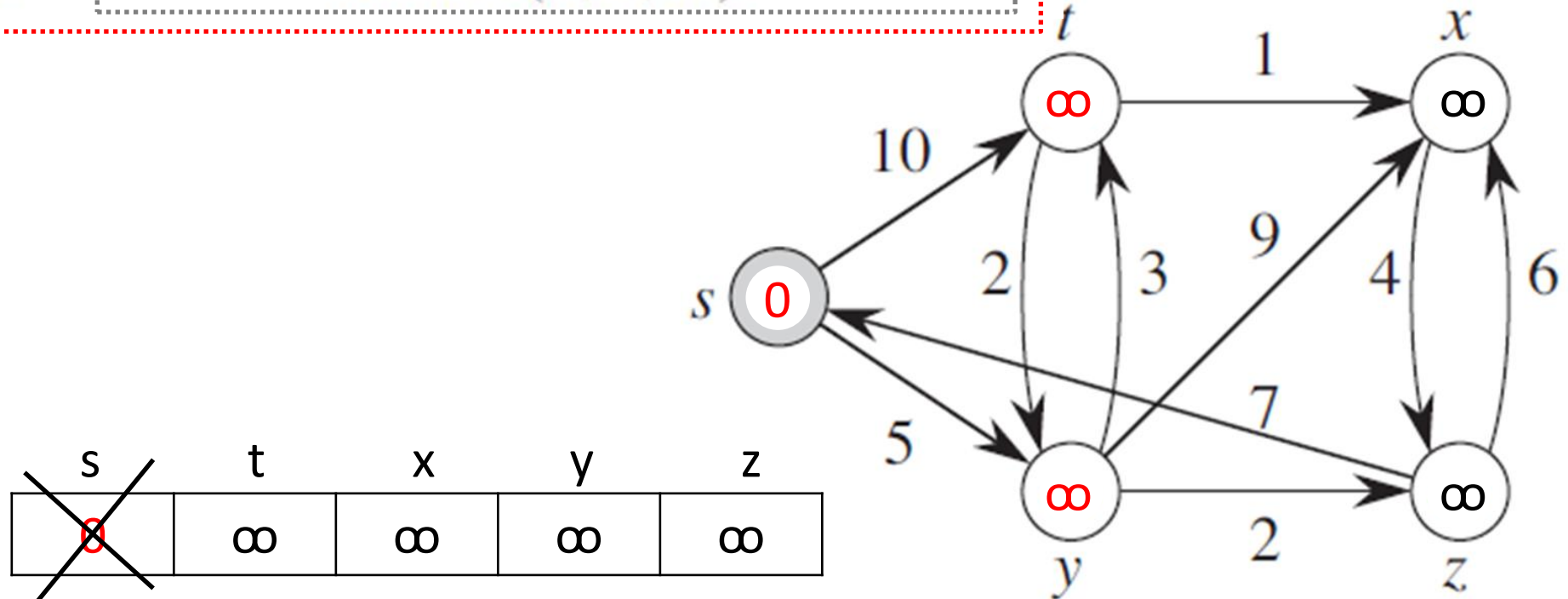
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )



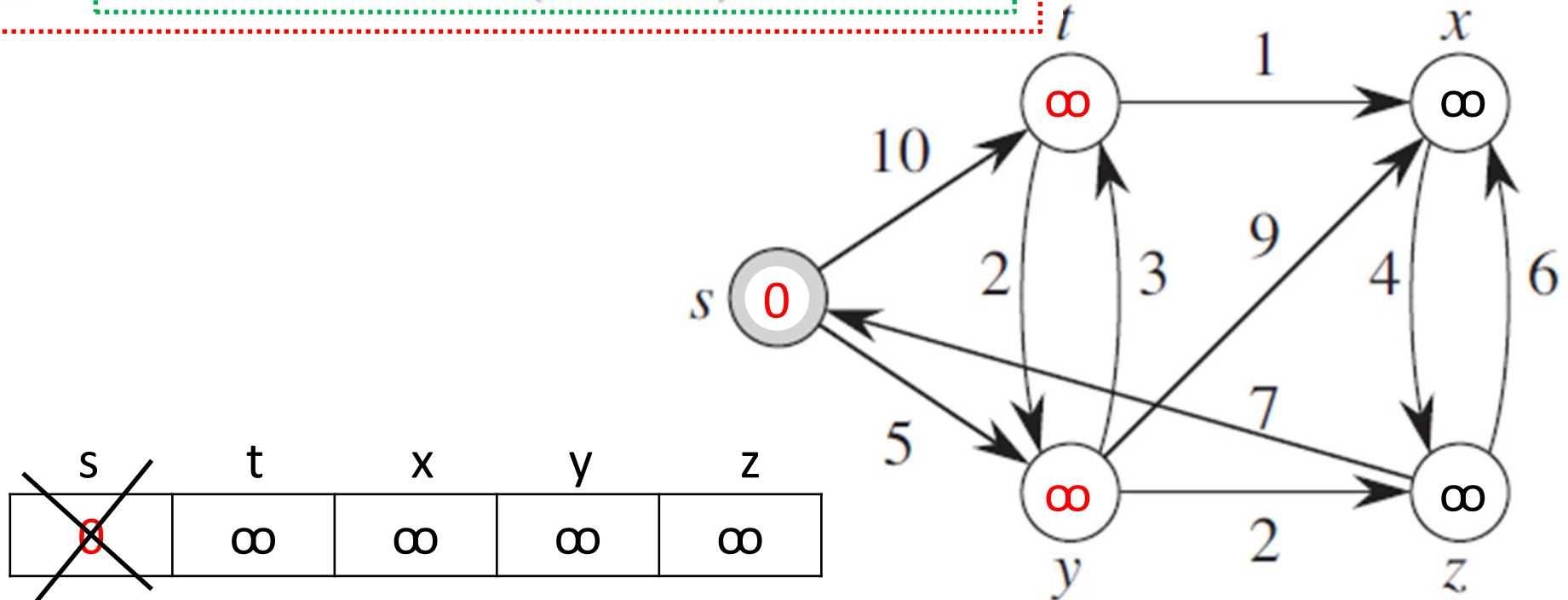


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )

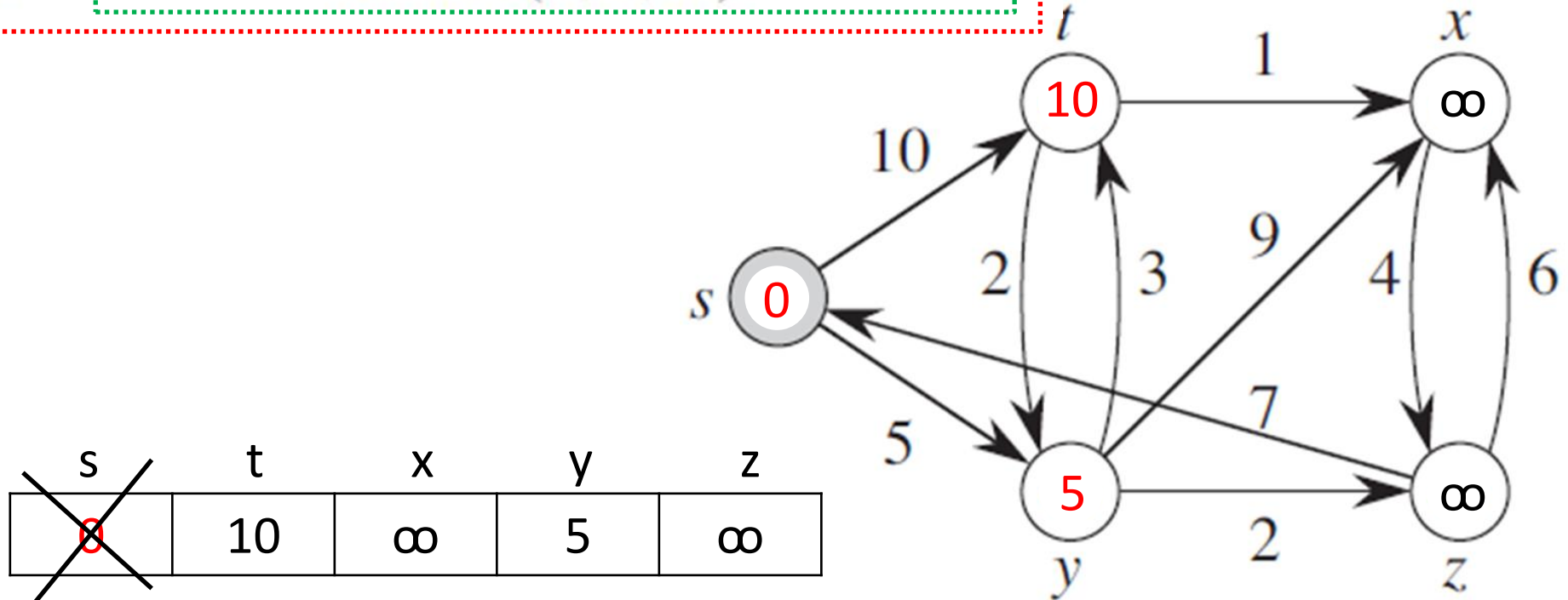


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $\rightarrow v.d = u.d + w(u, v)$   
3       $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )



<del>s</del>	t	x	y	z
<del>0</del>	10	$\infty$	5	$\infty$

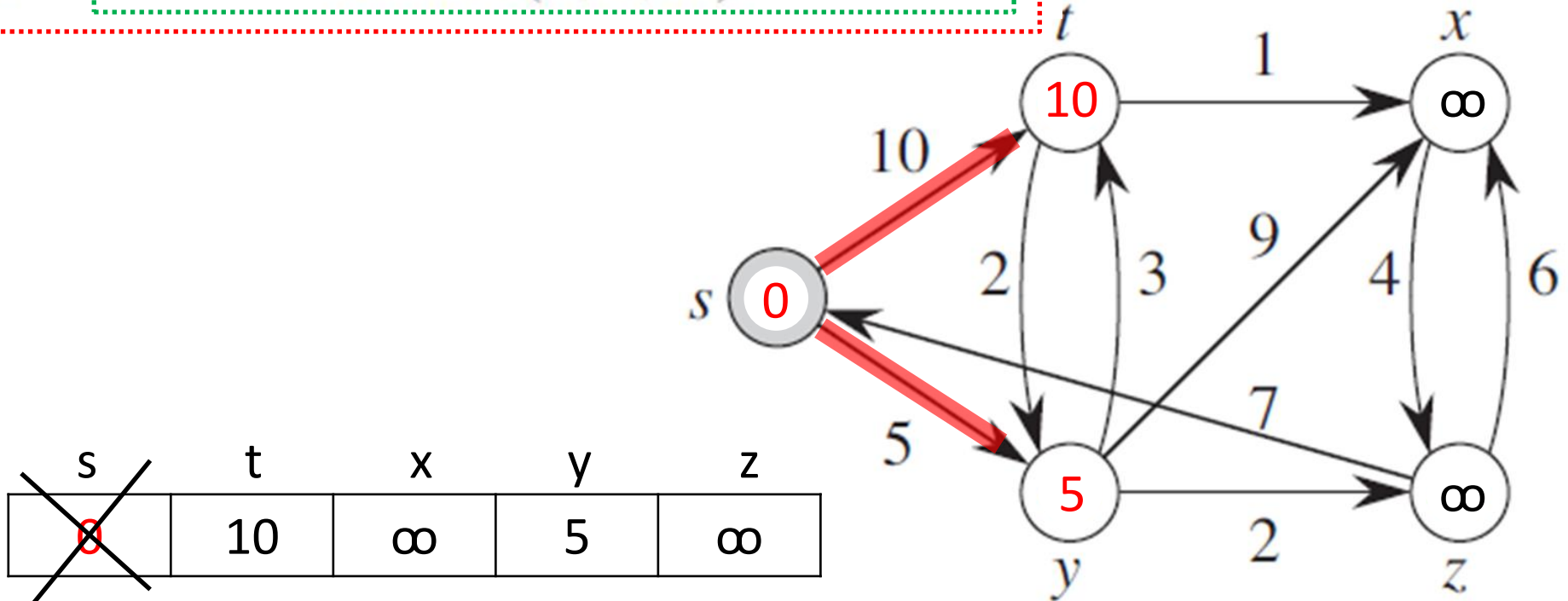


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $\rightarrow v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )



<del>s</del>	t	x	y	z
<del>0</del>	10	$\infty$	5	$\infty$

DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

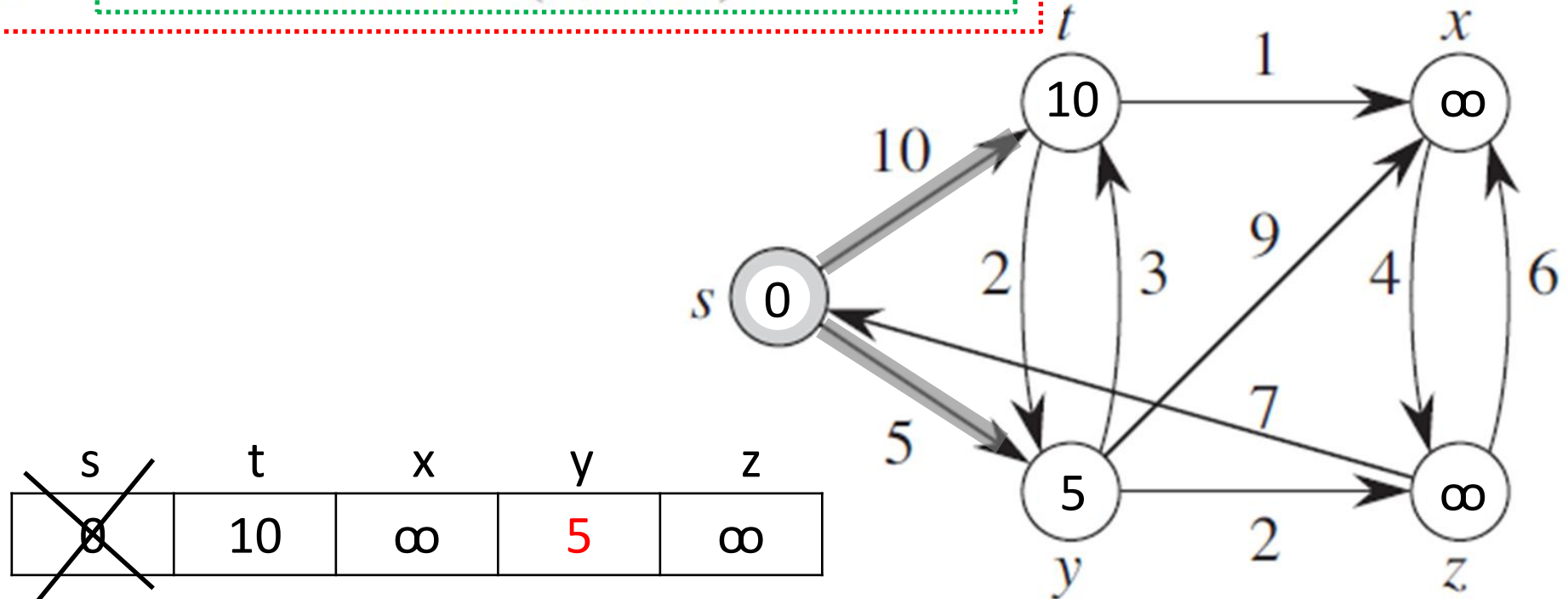
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

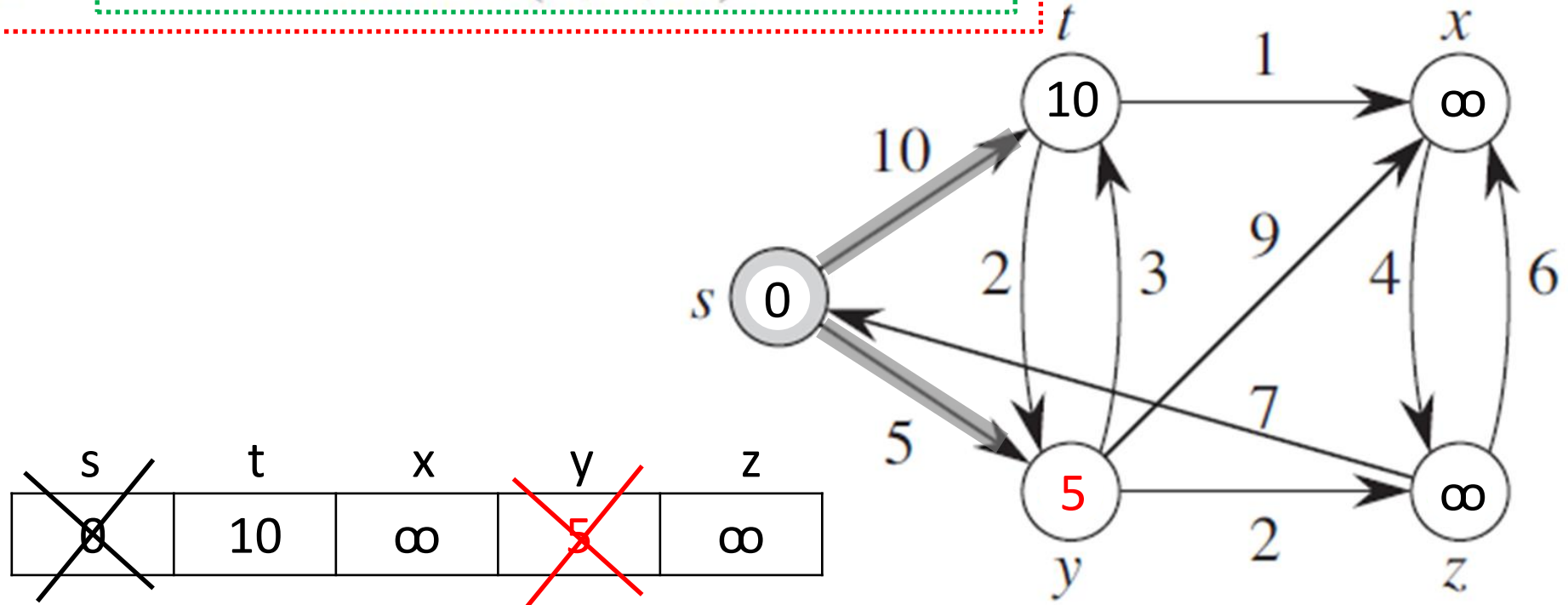
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4  $u = \text{EXTRACT-MIN}(Q)$

5 **for** each vertex  $v \in G.\text{Adj}[u]$

6 RELAX( $u, v, w$ )



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

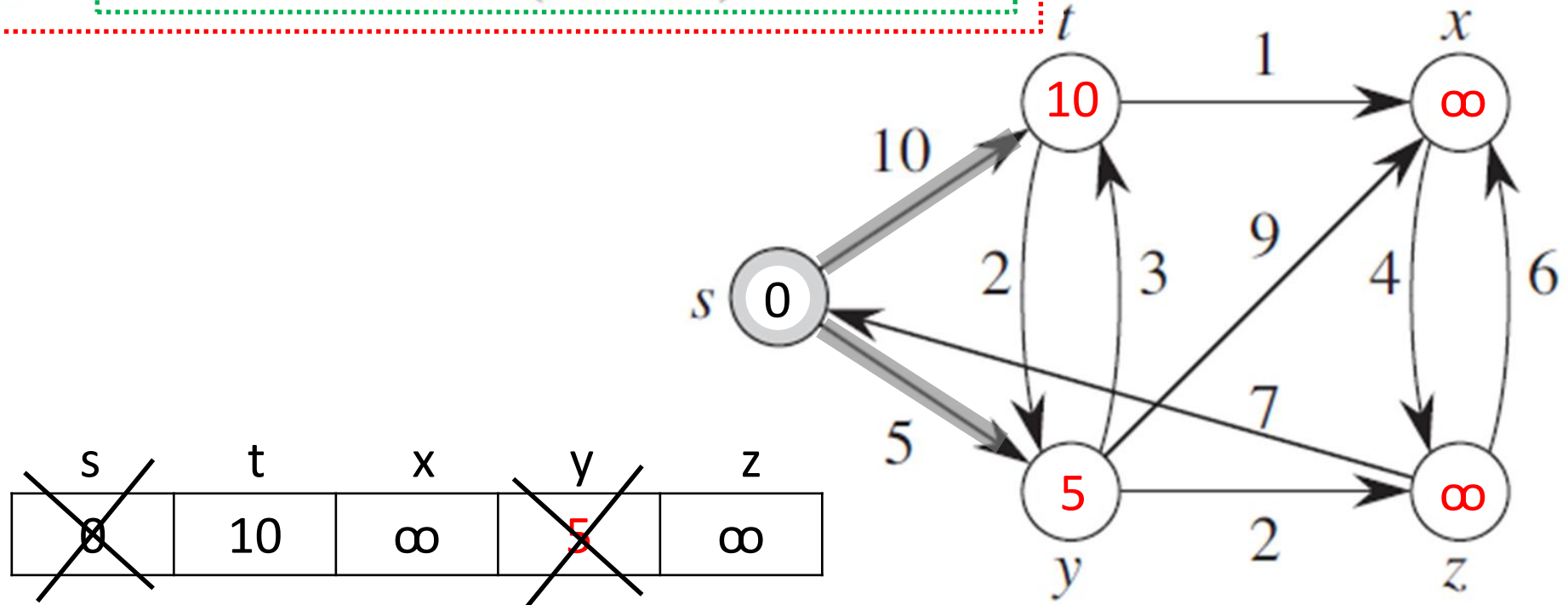
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )

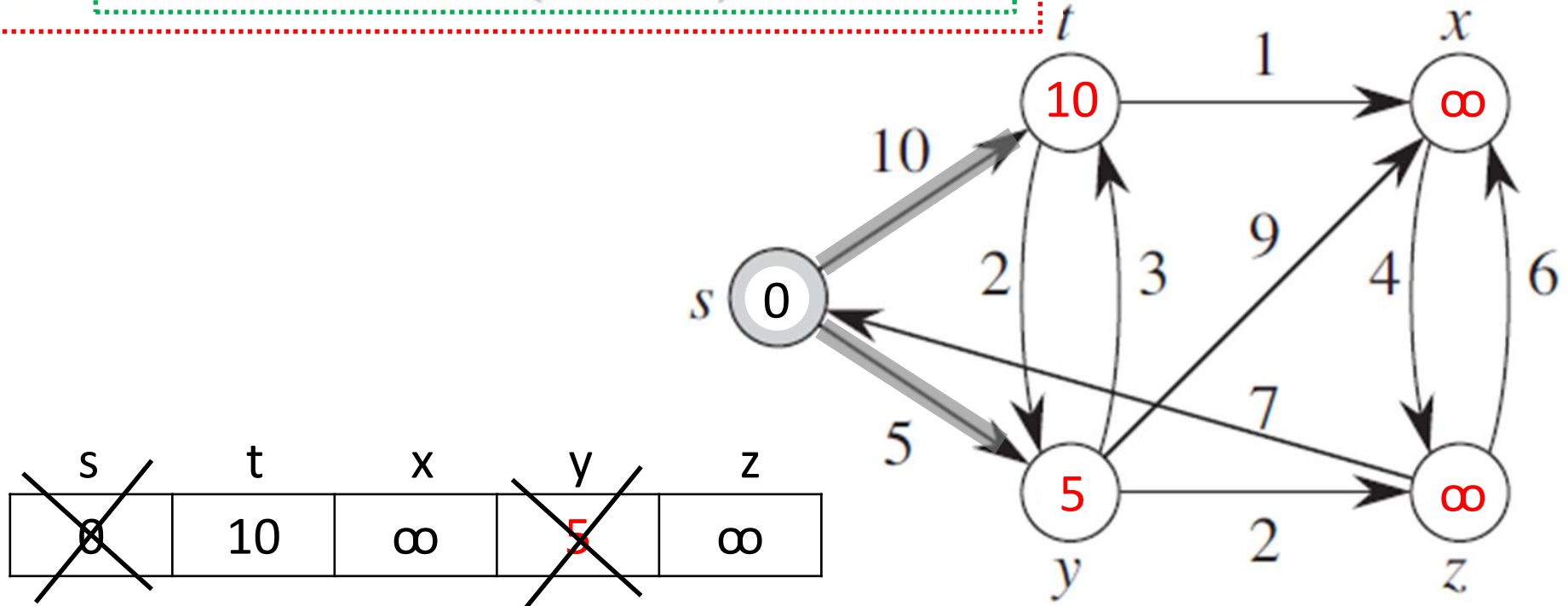


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )

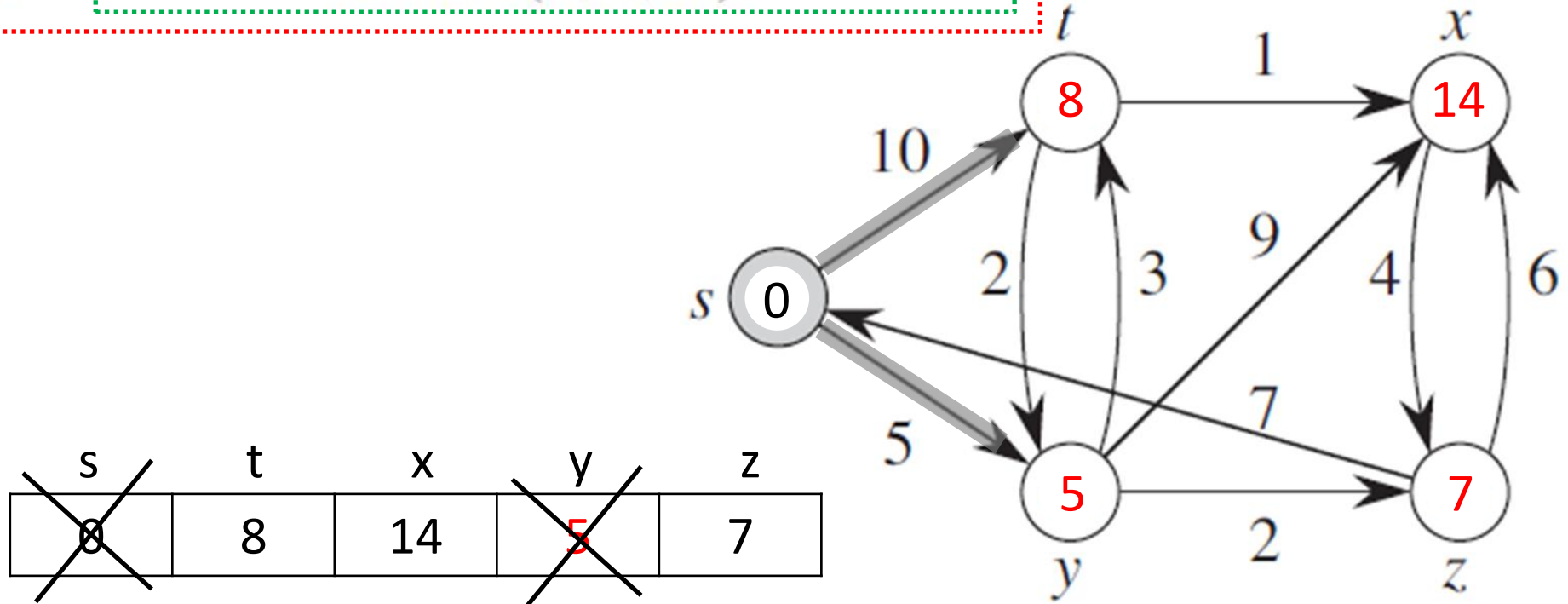


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $\rightarrow v.d = u.d + w(u, v)$   
3       $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )



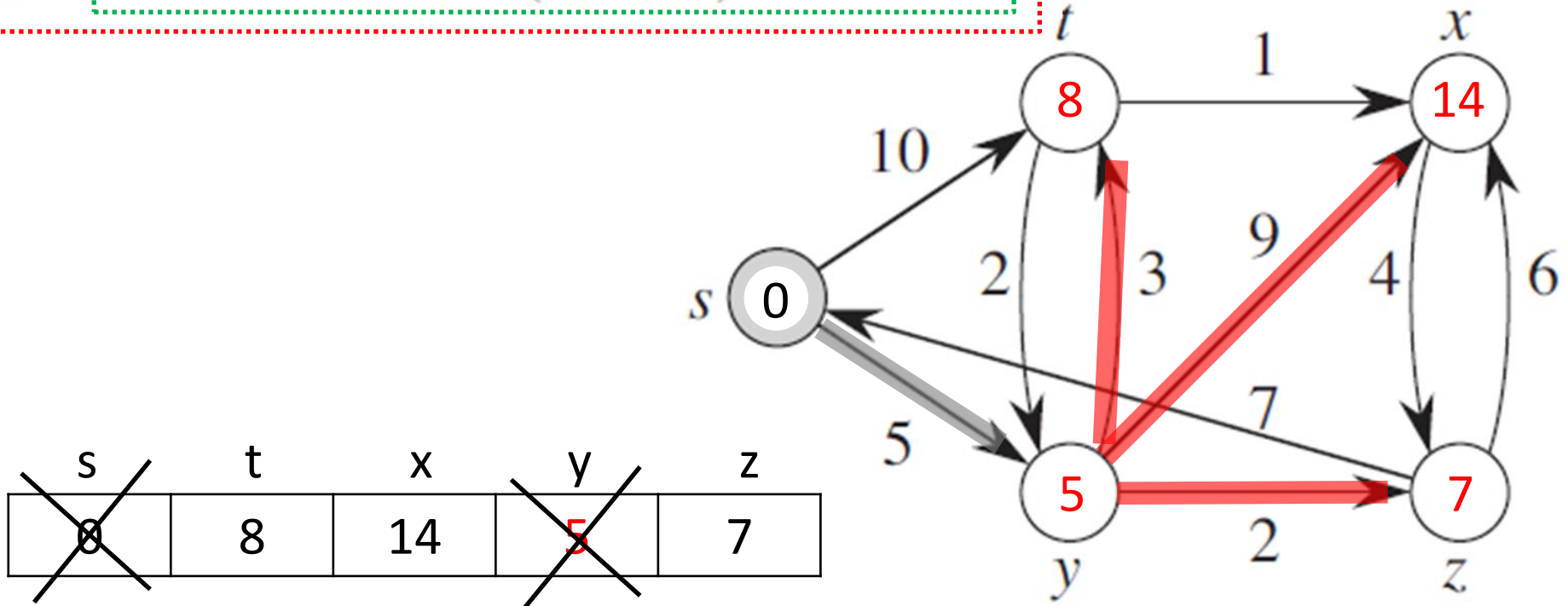


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $\rightarrow v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

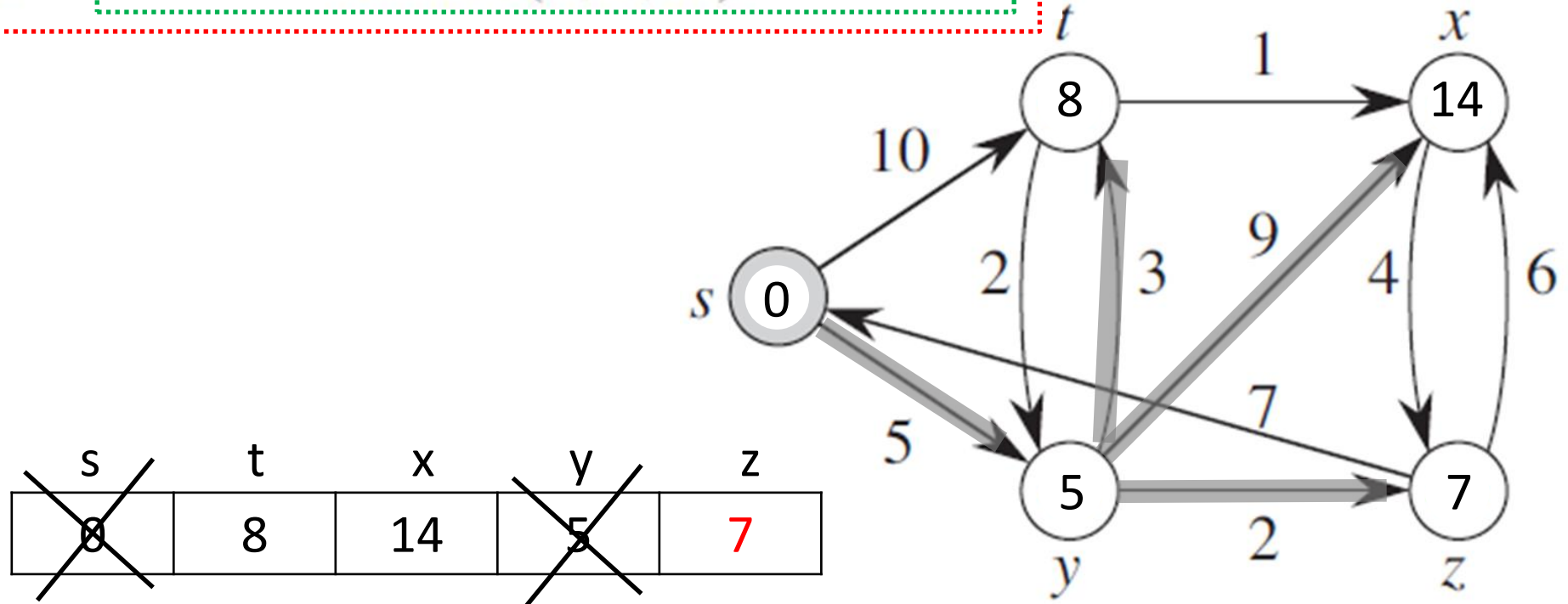
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )





DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

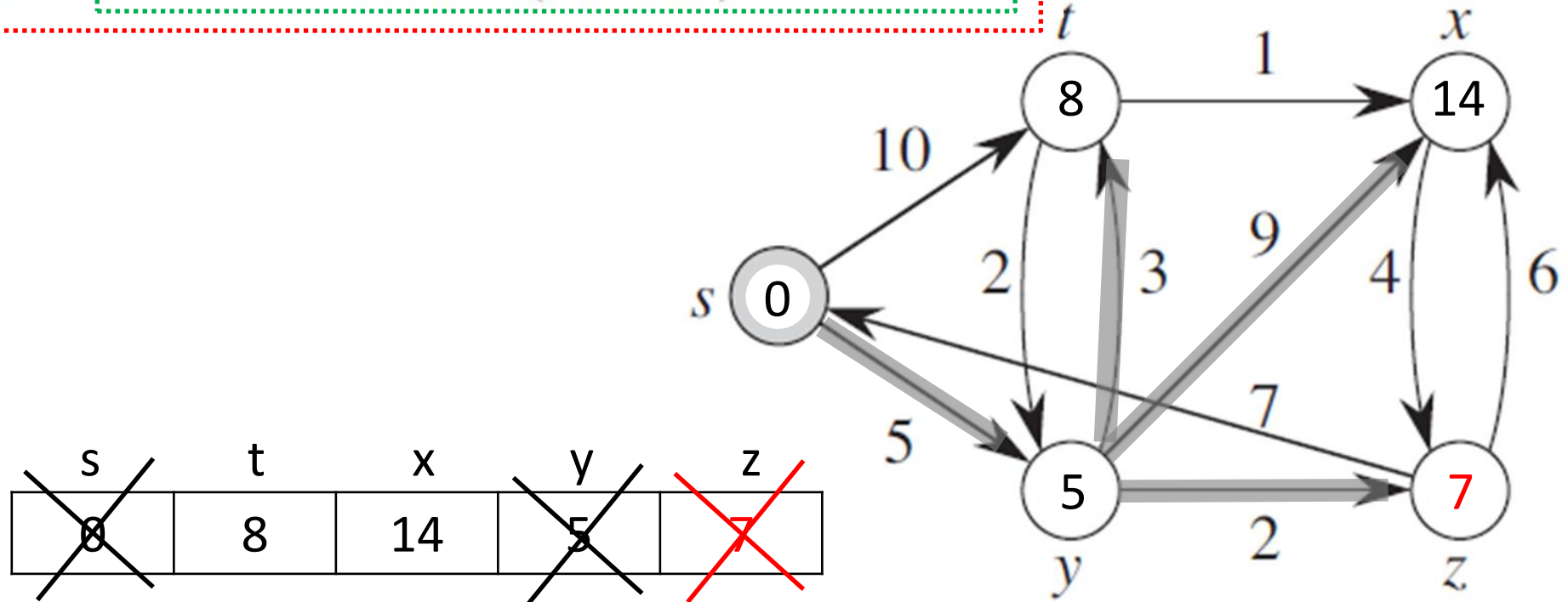
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4  $u = \text{EXTRACT-MIN}(Q)$

5 **for** each vertex  $v \in G.\text{Adj}[u]$

6  $\text{RELAX}(u, v, w)$



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

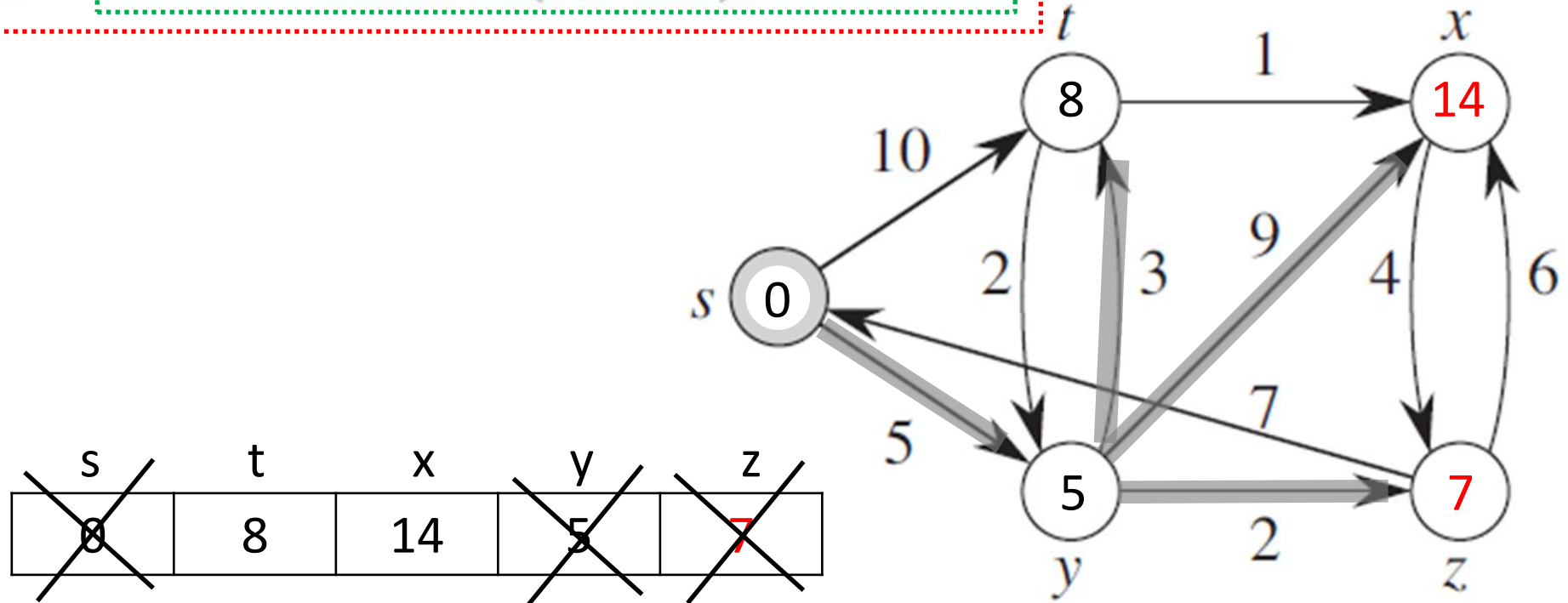
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )

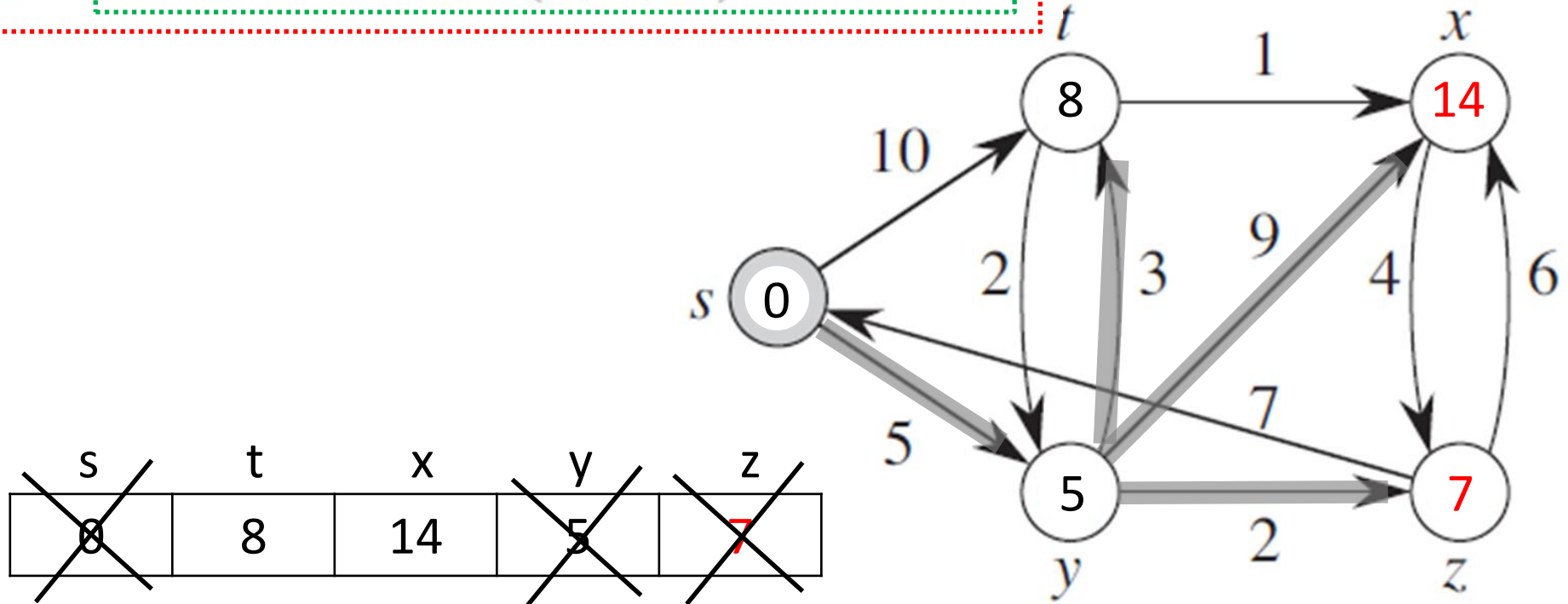


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )

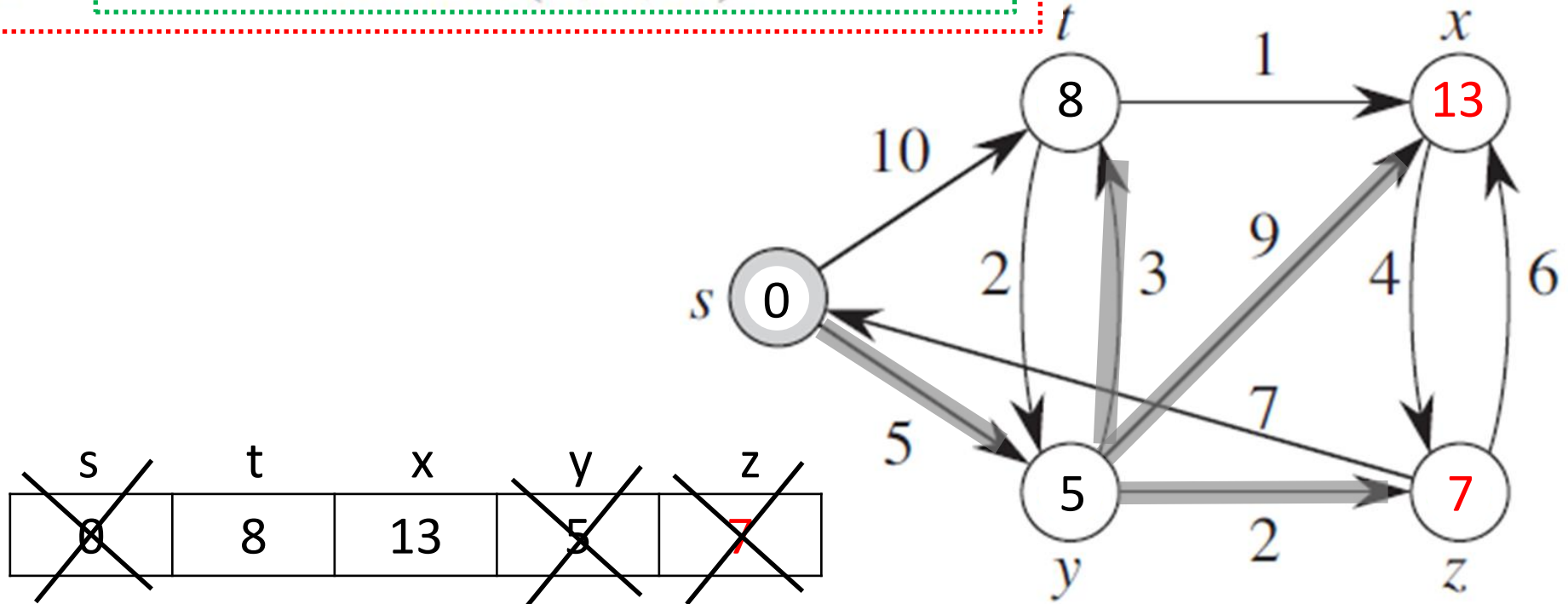


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $\rightarrow v.d = u.d + w(u, v)$   
3       $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

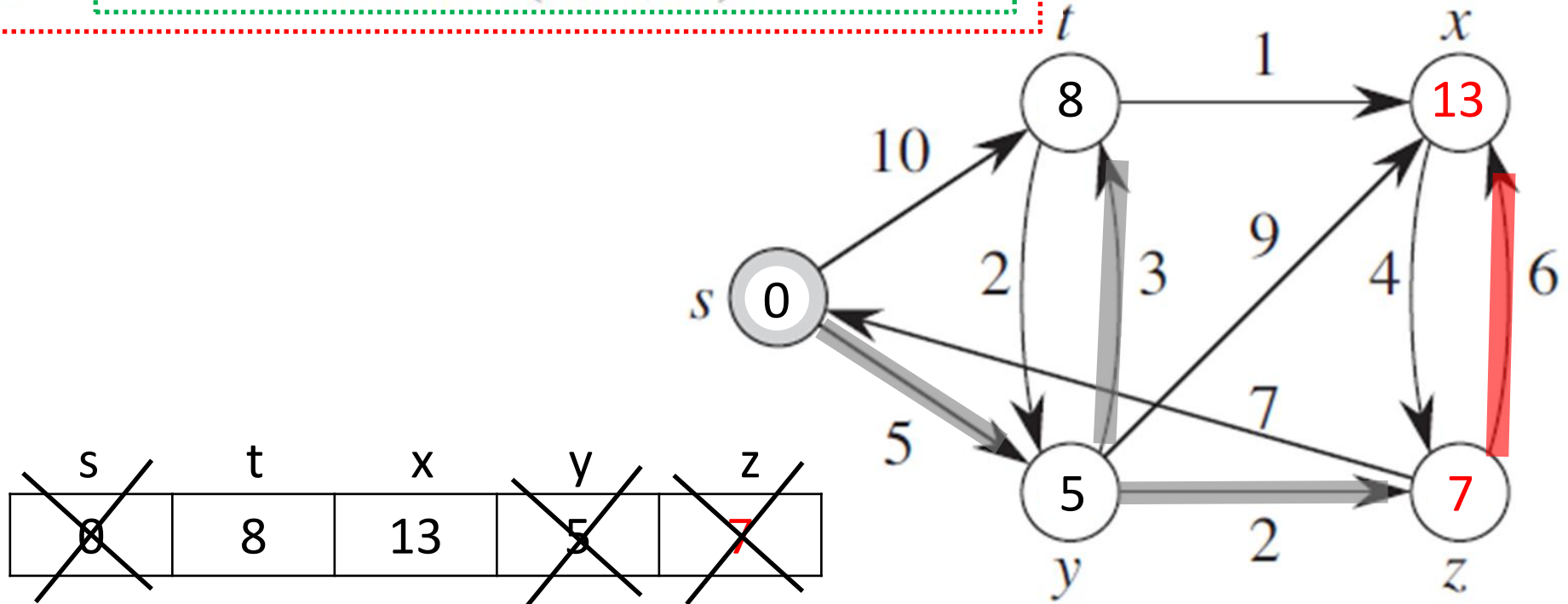
6 RELAX( $u, v, w$ )



RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $\rightarrow v.\pi = u$ 
```

```
5  for each vertex  $v \in G.Adj[u]$   
6      RELAX( $u, v, w$ )
```



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

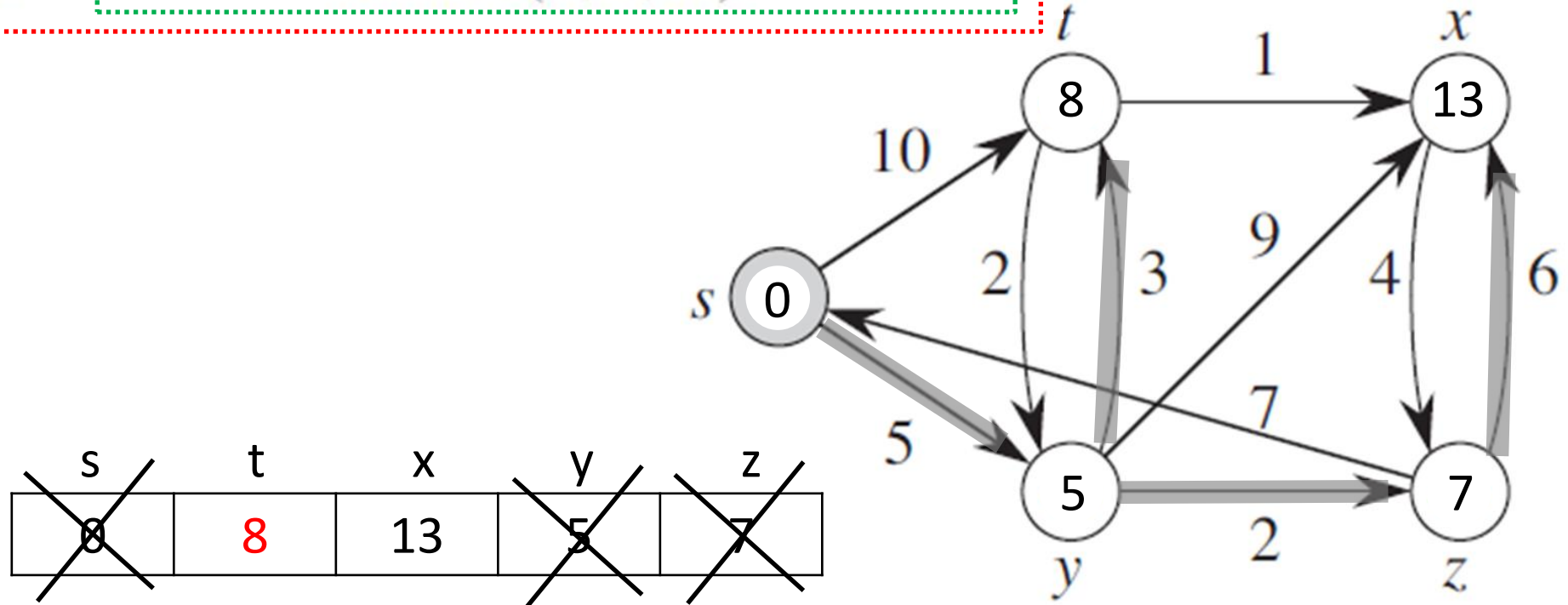
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )





DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

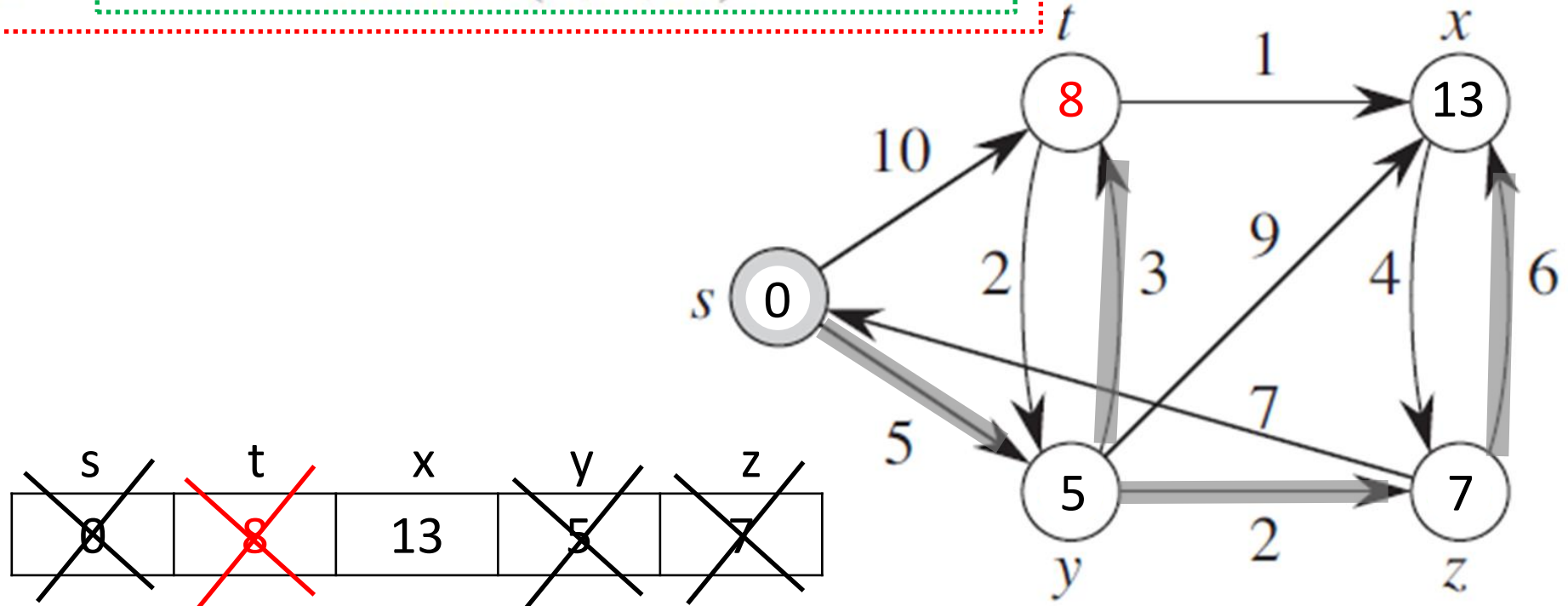
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4  $u = \text{EXTRACT-MIN}(Q)$

5 **for** each vertex  $v \in G.\text{Adj}[u]$

6  $\text{RELAX}(u, v, w)$



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

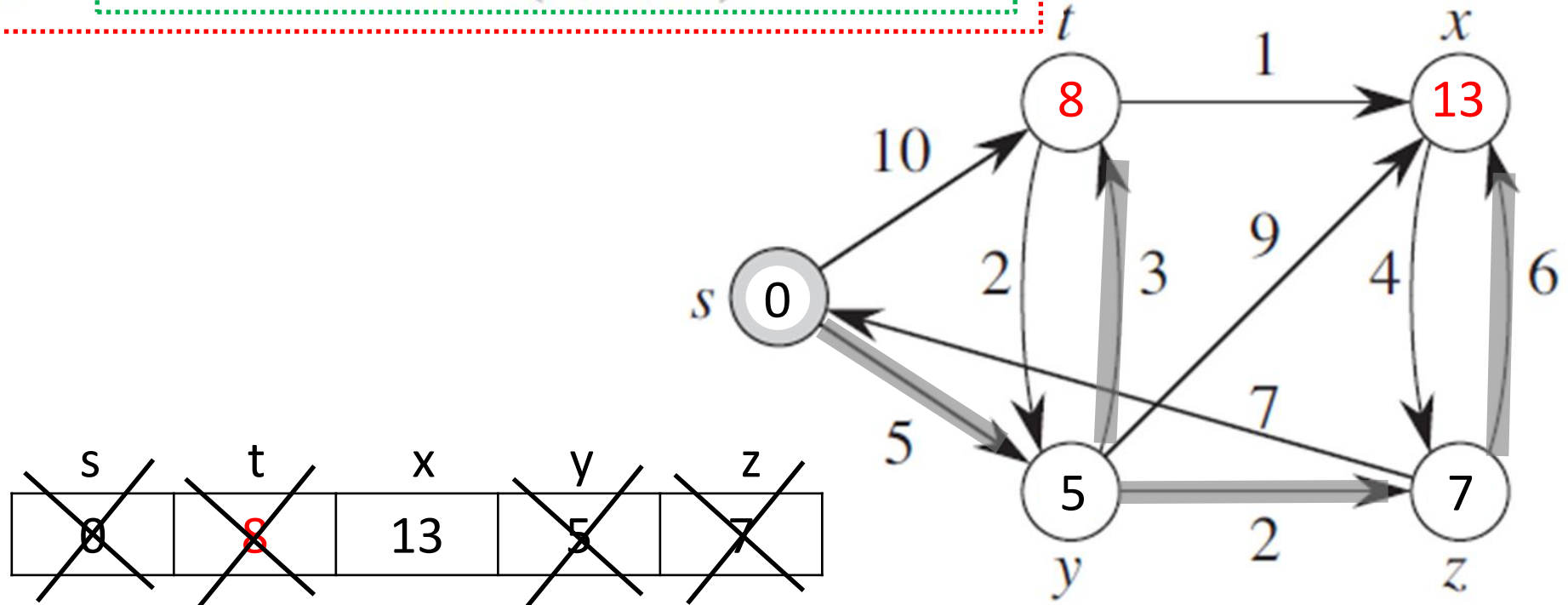
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )



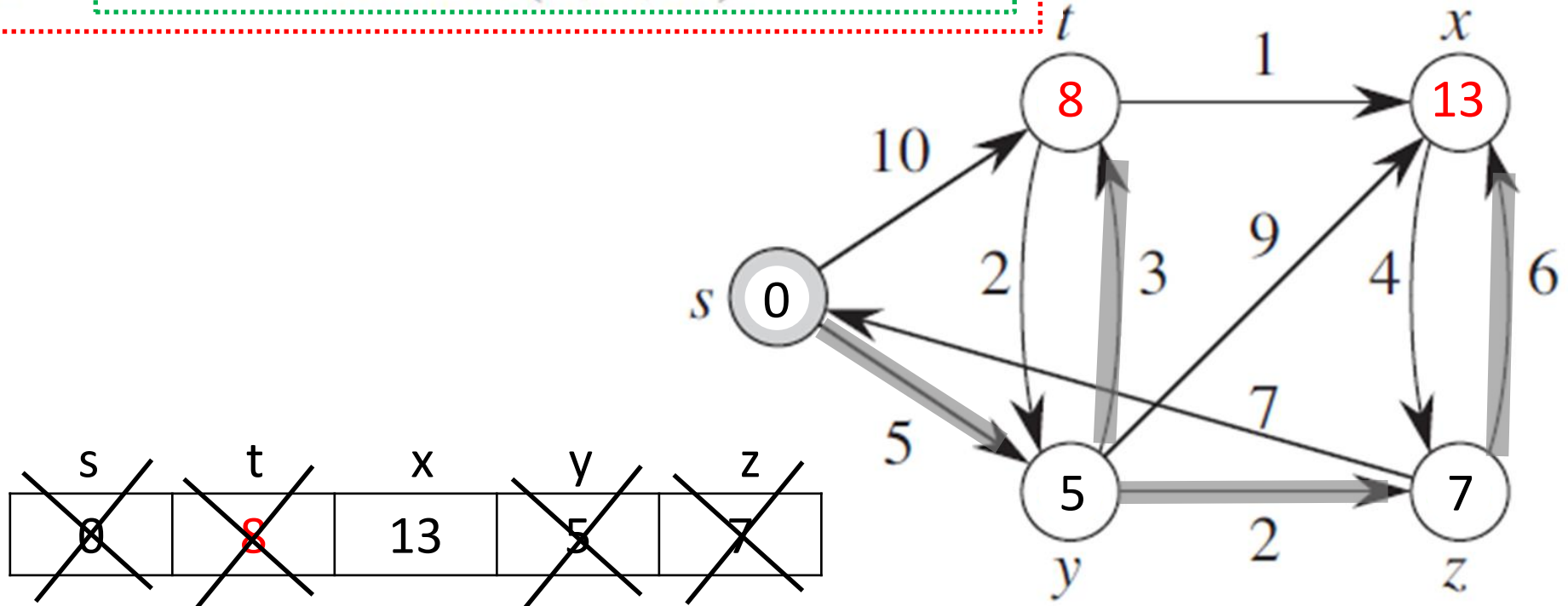


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )

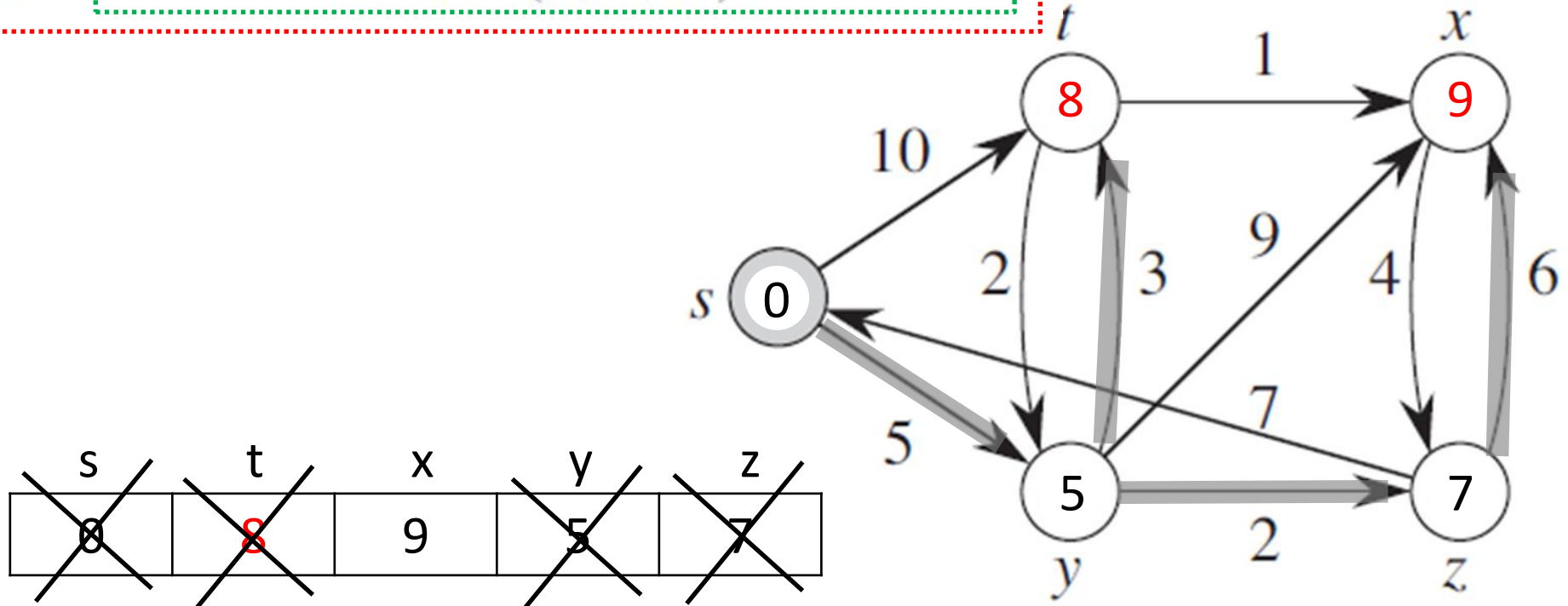


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2     $\rightarrow v.d = u.d + w(u, v)$   
3     $v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )

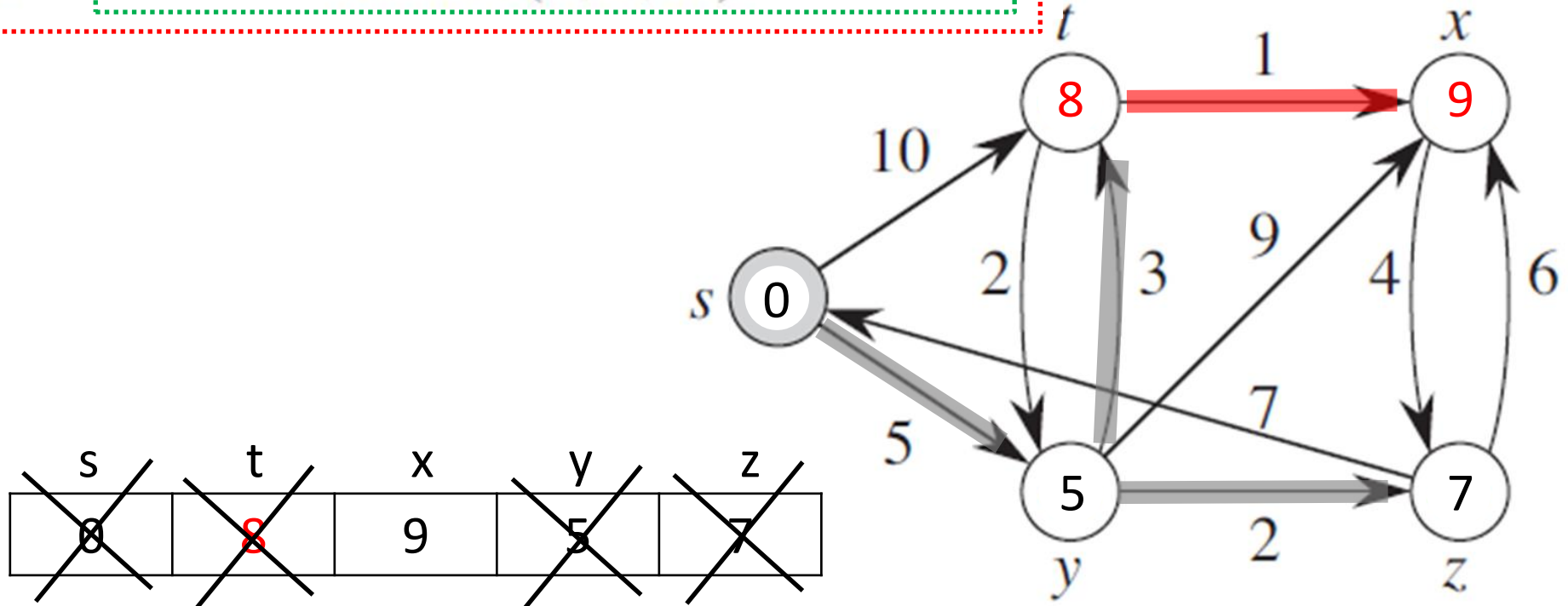


RELAX( $u, v, w$ )

```
1  if  $u.d + w(u, v) < v.d$   
2       $v.d = u.d + w(u, v)$   
3       $\rightarrow v.\pi = u$ 
```

5 **for each vertex**  $v \in G.Adj[u]$

6 RELAX( $u, v, w$ )



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

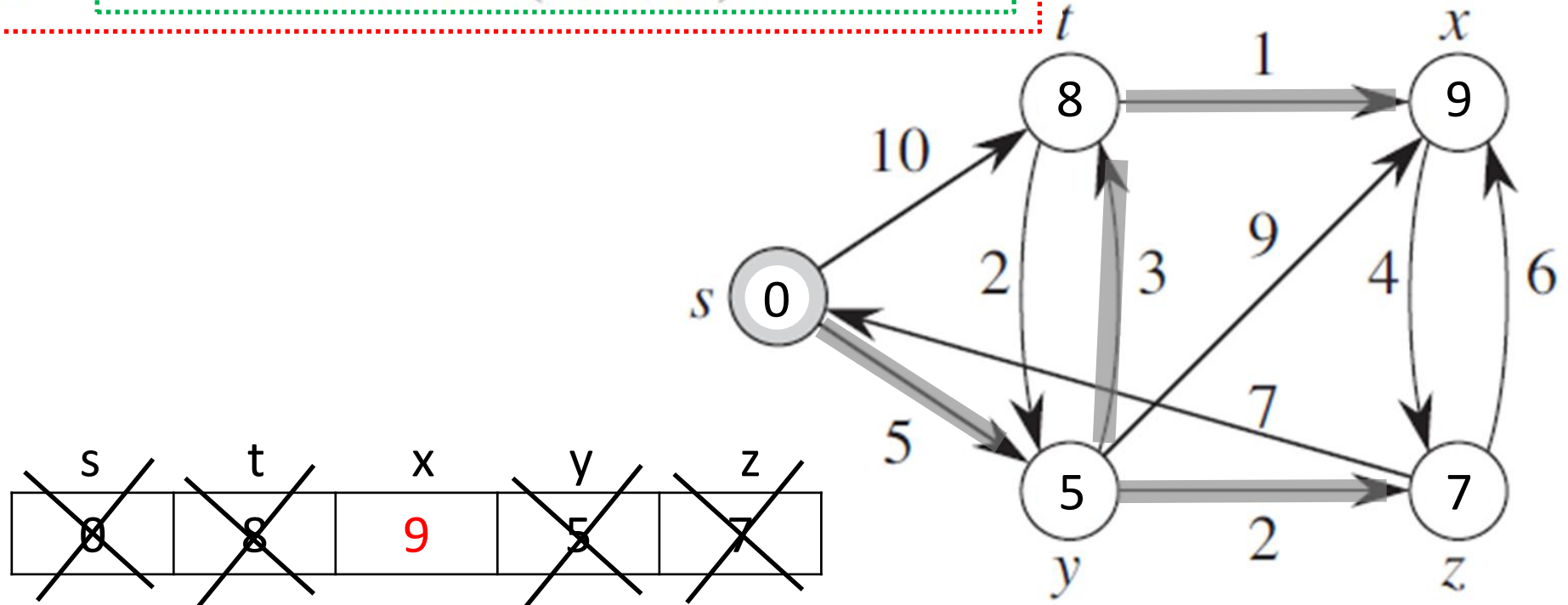
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

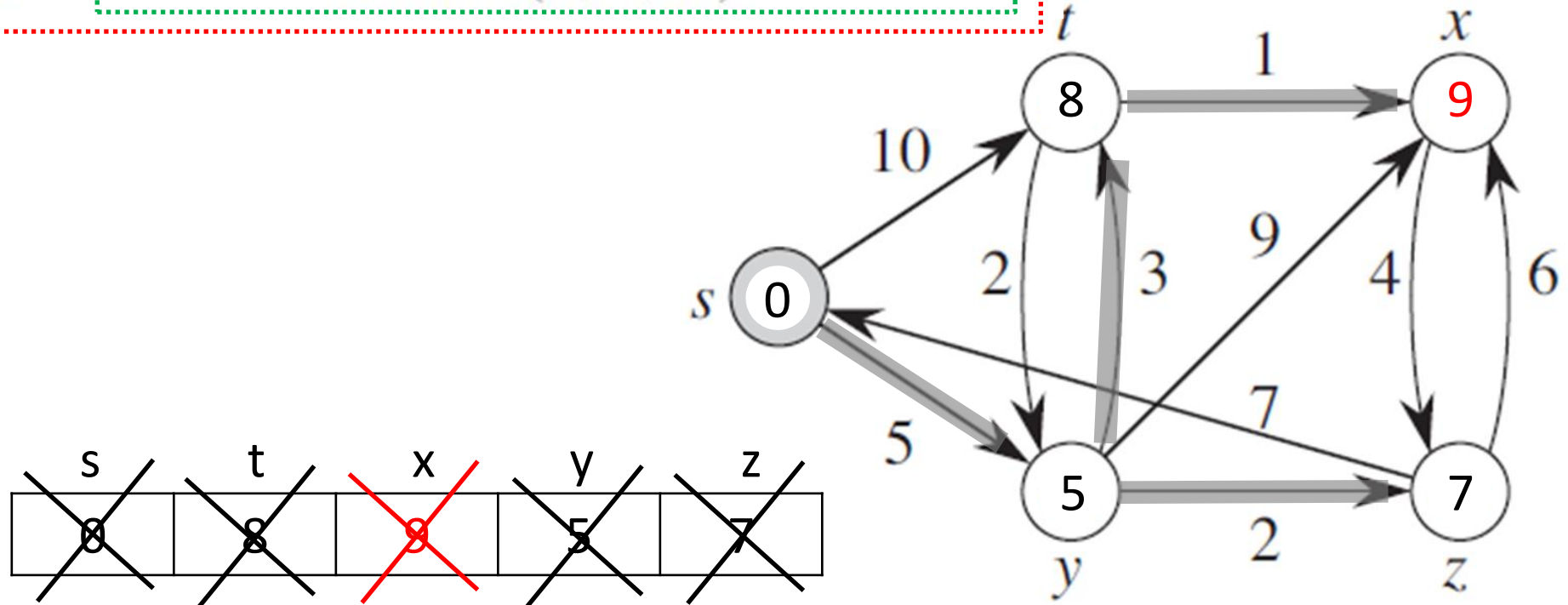
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4  $u = \text{EXTRACT-MIN}(Q)$

5 **for** each vertex  $v \in G.\text{Adj}[u]$

6  $\text{RELAX}(u, v, w)$



DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

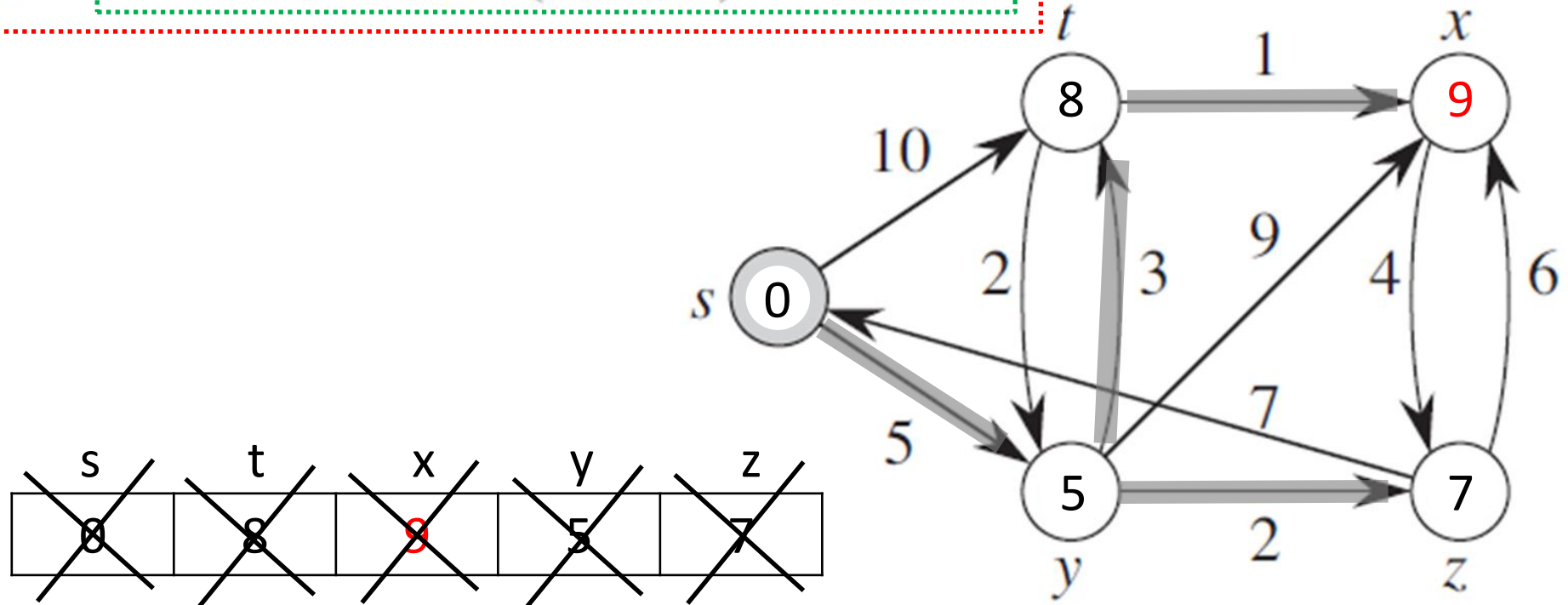
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )





DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

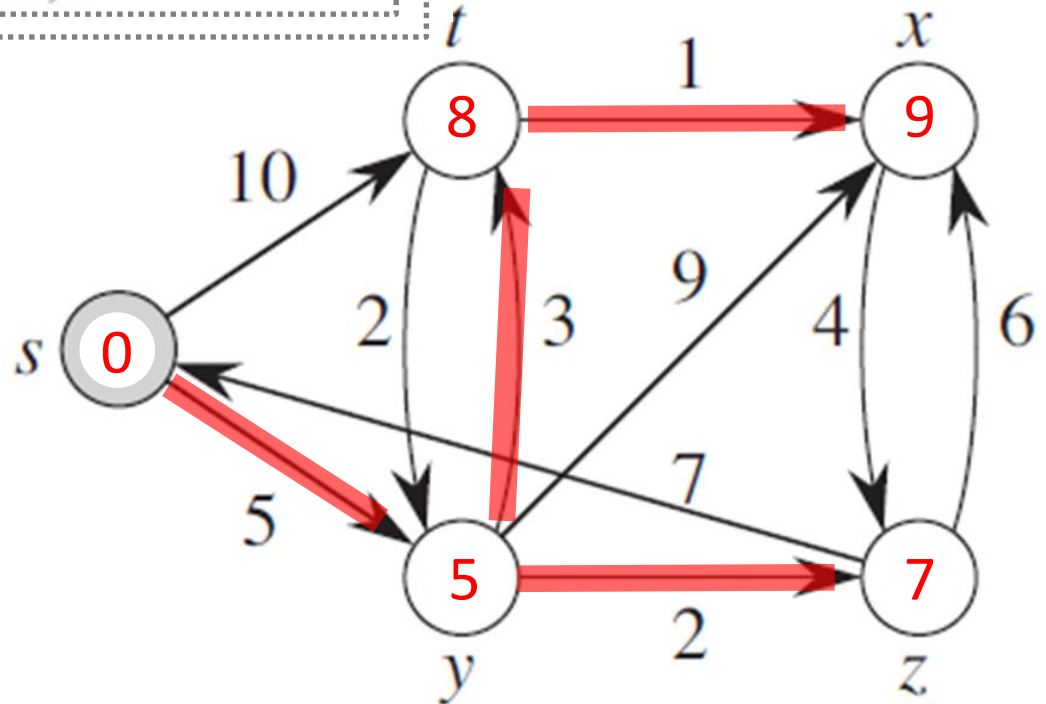
2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )



# Dijkstra

DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.Adj[u]$

6         RELAX( $u, v, w$ )

INITIALIZE-SINGLE-SOURCE( $G, s$ )

1 **for** each vertex  $v \in G.V$

2      $v.d = \infty$

3      $v.\pi = \text{NIL}$

4  $s.d = 0$



# Dijkstra

DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.\text{Adj}[u]$

6         RELAX( $u, v, w$ )

RELAX( $u, v, w$ )

1     **if**  $u.d + w(u, v) < v.d$

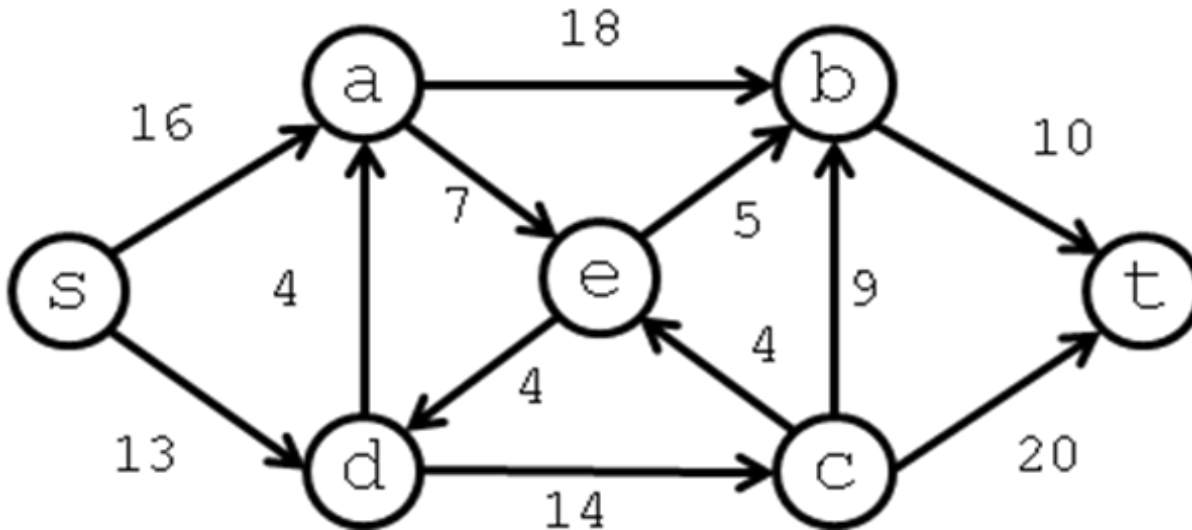
2          $v.d = u.d + w(u, v)$

3          $v.\pi = u$

# Exercícios

- Simule o algoritmo de **Dijkstra**:

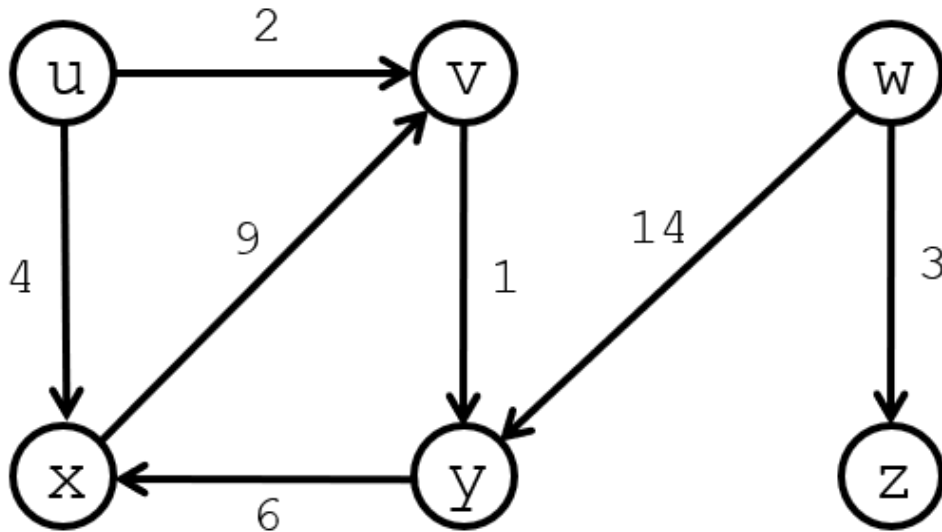
(a)



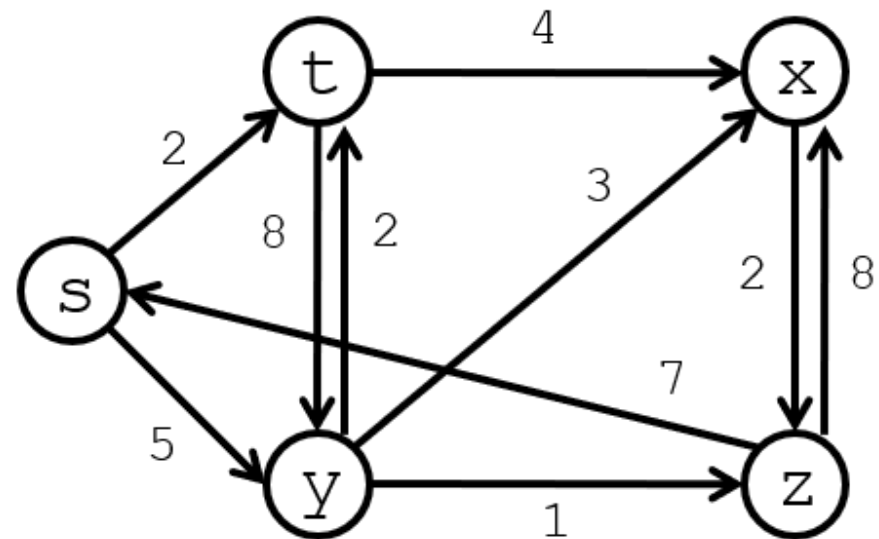
# Exercícios

- Simule o algoritmo de **Dijkstra**:

(b)



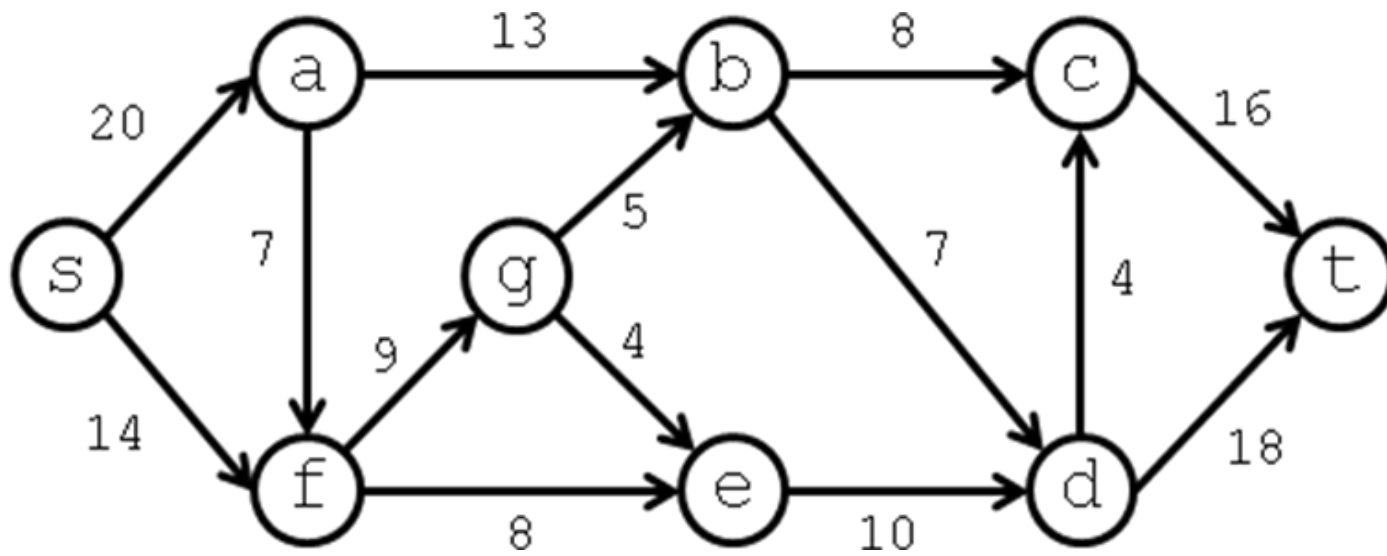
(c)



# Exercícios

- Simule o algoritmo de **Dijkstra**:

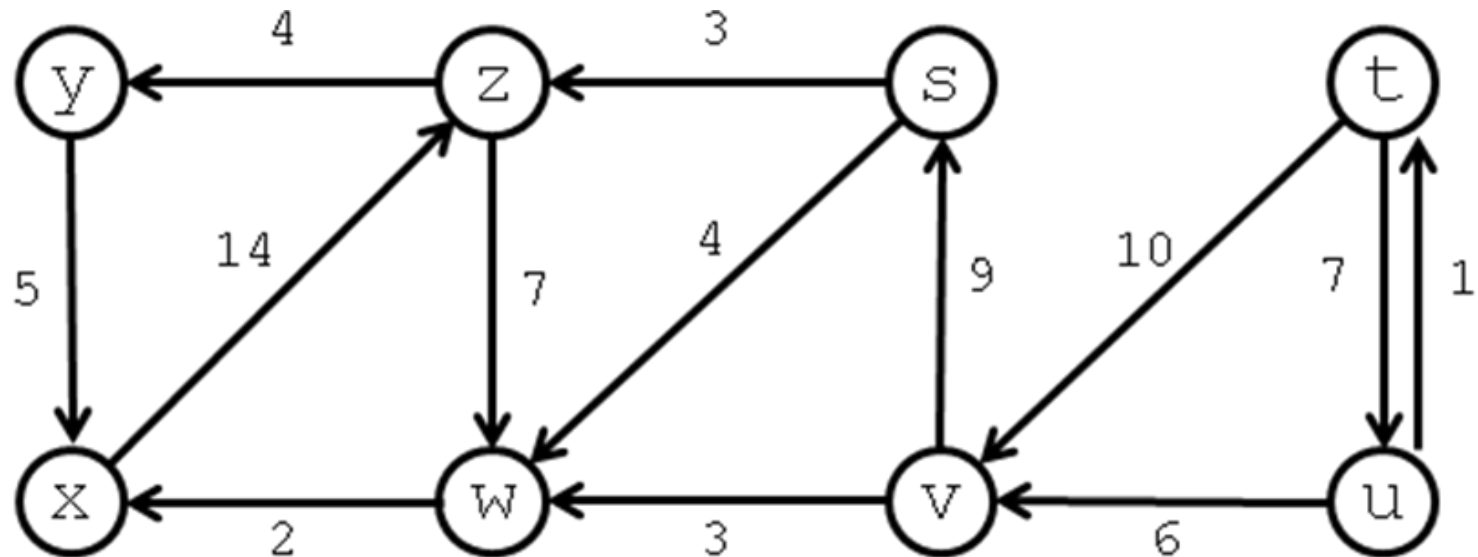
(d)



# Exercícios

- Simule o algoritmo de **Dijkstra**:

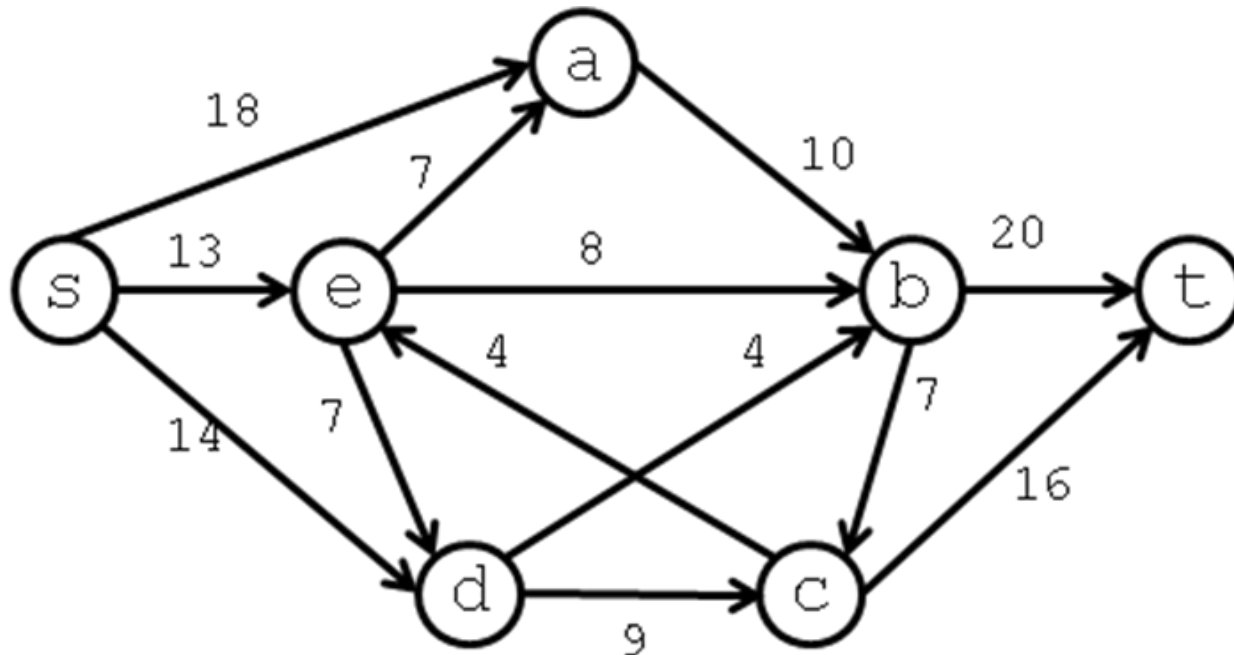
(e)



# Exercícios

- Simule o algoritmo de **Dijkstra**:

(f)



# Consumo de tempo?

DIJKSTRA( $G, w, s$ )

1 INITIALIZE-SINGLE-SOURCE( $G, s$ )

2  $Q = G.V$

3 **while**  $Q \neq \emptyset$

4      $u = \text{EXTRACT-MIN}(Q)$

5     **for** each vertex  $v \in G.Adj[u]$

6         RELAX( $u, v, w$ )

INITIALIZE-SINGLE-SOURCE( $G, s$ )

1 **for** each vertex  $v \in G.V$

2      $v.d = \infty$

3      $v.\pi = \text{NIL}$

4  $s.d = 0$

RELAX( $u, v, w$ )

1 **if**  $u.d + w(u, v) < v.d$

2      $v.d = u.d + w(u, v)$

3      $v.\pi = u$

# Exercício Programa

- 10-dijkstra.py