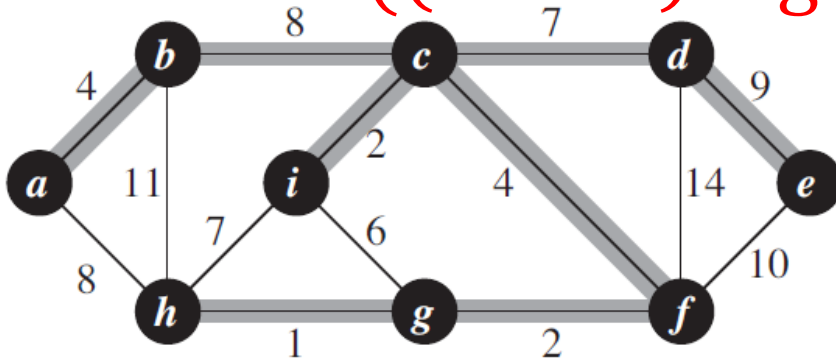


# Introdução à Teoria dos Grafos

Prof. Alexandre Noma

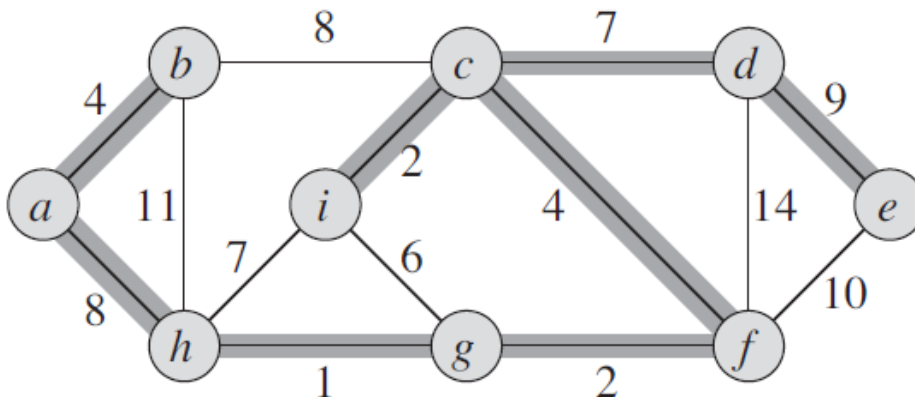
# Aula passada: Prim vs Kruskal

- Prim  $O((n + m) \log n)$



$$w(T) = 4 + 8 + 7 + 9 + 4 + 2 + 1 + 2 = 37$$

- Kruskal  $\Omega(m \log m)$



$$w(T) = 1 + 2 + 2 + 4 + 4 + 7 + 8 + 9 = 37$$

# Conjuntos disjuntos

- Coleção  $S = \{S_1, S_1, \dots, S_k\}$  de conjuntos disjuntos.
- Cada conjunto é identificado por um representante.
- Ex.

$S_1$	$S_2$	$S_3$	$S_4$	$S_5$
$\{\mathbf{a}, b, c, d\}$	$\{e, \mathbf{g}\}$	$\{\mathbf{f}\}$	$\{h, \mathbf{i}\}$	$\{\mathbf{j}\}$
- Operações
  - **MakeSet**(x): Cria novo conjunto com único elemento x.
  - **FindSet**(x): Devolve o representante de  $S_x$ .
  - **Union**(x, y): Une dois conjuntos  $S_x$  e  $S_y$ .

# Consumo de tempo

**MST-Kruskal** ( $G, w$ )

1	$T = \emptyset$	???
2	para cada vértice $u$ em $G.V$ faça	???
3	<b>MakeSet</b> ( $u$ )	???
4	ordenar arestas $G.E$ por peso (crescente)	???
<hr/>		
5	para cada aresta $uv$ em $G.E$ (ordenada) faça	???
6	se <b>FindSet</b> ( $u$ ) $\neq$ <b>FindSet</b> ( $v$ )	???
7	entao <b>Union</b> ( $u, v$ )	???
8	$T = T \cup \{uv\}$	???
9	devolva $T$	???

**Total:**

**$T(n, m) = ???$**

# Consumo de tempo

**MST-Kruskal** ( $G, w$ )

1	$T = \emptyset$	$O(1)$
2	para cada vértice $u$ em $G.V$ faça	$O(n)$
3	<b>MakeSet</b> ( $u$ )	???
4	ordenar arestas $G.E$ por peso (crescente)	$O(m \log m)$
<hr/>		
5	para cada aresta $uv$ em $G.E$ (ordenada) faça	$O(m)$
6	se <b>FindSet</b> ( $u$ ) $\neq$ <b>FindSet</b> ( $v$ )	???
7	entao <b>Union</b> ( $u, v$ )	???
8	$T = T \cup \{uv\}$	$O(m) * O(1)$
9	devolva $T$	$O(1)$

**Total:**

**$T(n, m) = ???$**

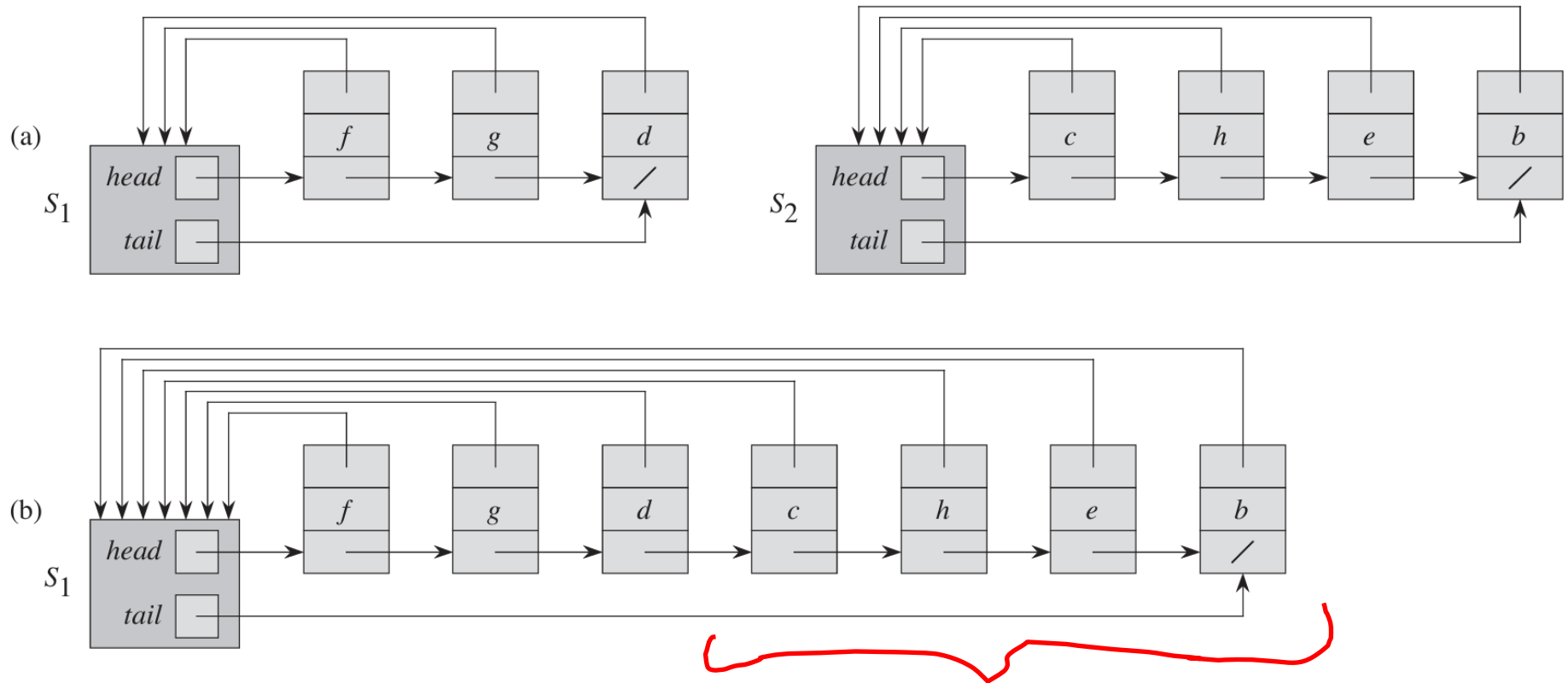
# Conjuntos disjuntos

- Operações
  - **MakeSet**(x): consome  **$O(1)$**  unidades de tempo.
  - **FindSet**(x): Devolve o representante de  $S_x$ .
  - **Union**(x, y): Une dois conjuntos
- **m** operações **FindSet**(x) e **Union**(x,y) consomem  **$O(m \log m)$**  unidades de tempo

# Livro: Introduction to algorithms

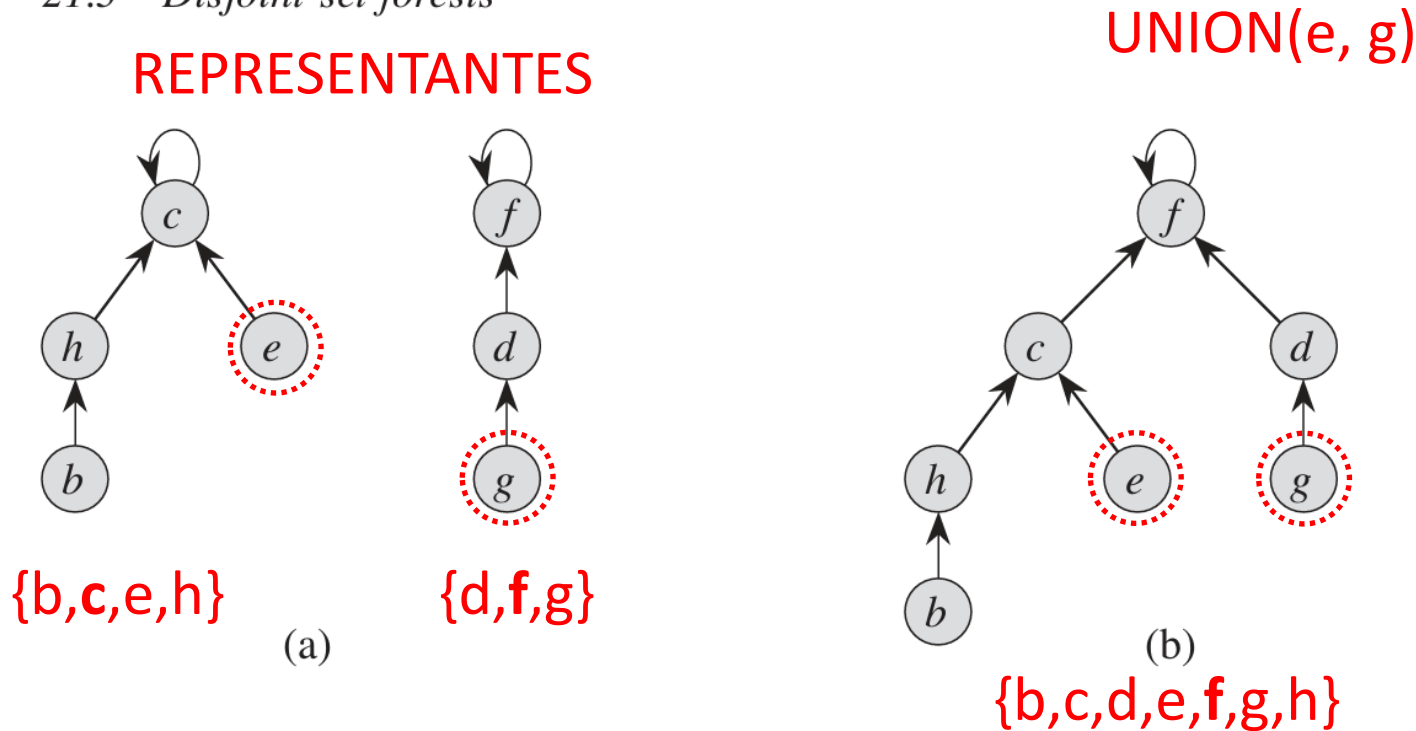
## (CLRS: Cormen, Leiserson, Rivest, Stein)

The running time of Kruskal's algorithm for a graph  $G = (V, E)$  depends on how we implement the disjoint-set data structure. We assume that we use the disjoint-set-forest implementation of Section 21.3 with the union-by-rank and path-compression heuristics, since it is the asymptotically fastest implementation known. Initializing the set  $A$  in line 1 takes  $O(1)$  time, and the time to sort the edges in line 4 is  $O(E \lg E)$ . (We will account for the cost of the  $|V|$  MAKE-SET operations in the **for** loop of lines 2–3 in a moment.) The **for** loop of lines 5–8 performs  $O(E)$  FIND-SET and UNION operations on the disjoint-set forest. Along with the  $|V|$  MAKE-SET operations, these take a total of  $O((V + E) \alpha(V))$  time, where  $\alpha$  is the very slowly growing function defined in Section 21.4. Because we assume that  $G$  is connected, we have  $|E| \geq |V| - 1$ , and so the disjoint-set operations take  $O(E \alpha(V))$  time. Moreover, since  $\alpha(|V|) = O(\lg V) = O(\lg E)$ , the total running time of Kruskal's algorithm is  $O(E \lg E)$ .

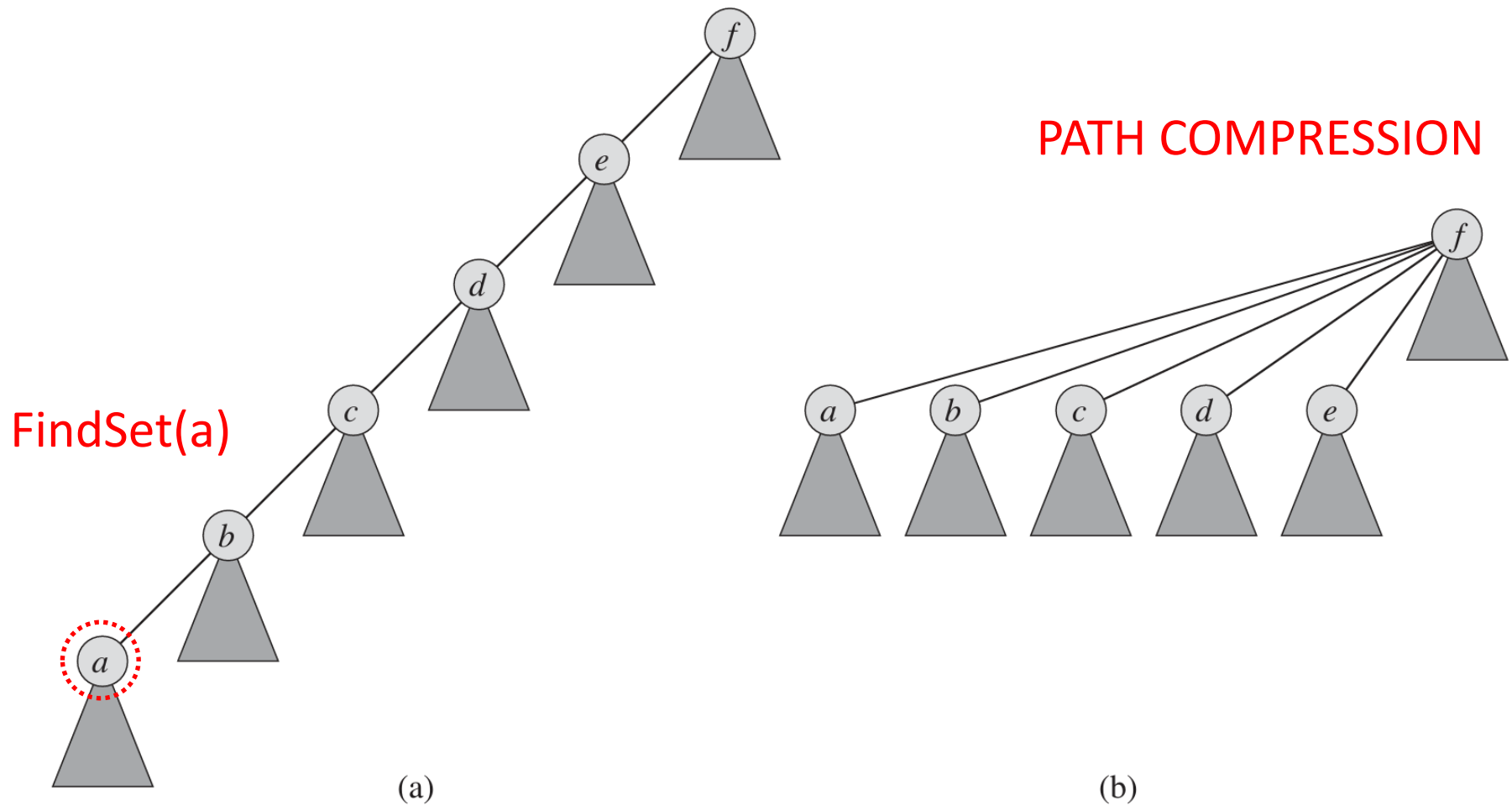


**Figure 21.2** (a) Linked-list representations of two sets. Set  $S_1$  contains members  $d$ ,  $f$ , and  $g$ , with representative  $f$ , and set  $S_2$  contains members  $b$ ,  $c$ ,  $e$ , and  $h$ , with representative  $c$ . Each object in the list contains a set member, a pointer to the next object in the list, and a pointer back to the set object. Each set object has pointers *head* and *tail* to the first and last objects, respectively. (b) The result of  $\text{UNION}(g, e)$ , which appends the linked list containing  $e$  to the linked list containing  $g$ . The representative of the resulting set is  $f$ . The set object for  $e$ 's list,  $S_2$ , is destroyed.





**Figure 21.4** A disjoint-set forest. **(a)** Two trees representing the two sets of Figure 21.2. The tree on the left represents the set  $\{b, c, e, h\}$ , with  $c$  as the representative, and the tree on the right represents the set  $\{d, f, g\}$ , with  $f$  as the representative. **(b)** The result of  $\text{UNION}(e, g)$ .



**Figure 21.5** Path compression during the operation FIND-SET. Arrows and self-loops at roots are omitted. **(a)** A tree representing a set prior to executing FIND-SET(*a*). Triangles represent subtrees whose roots are the nodes shown. Each node has a pointer to its parent. **(b)** The same set after executing FIND-SET(*a*). Each node on the find path now points directly to the root.

# Conjuntos disjuntos

- Operações
  - **MakeSet**(x): consome  **$O(1)$**  unidades de tempo.
  - **FindSet**(x): Devolve o representante de  $S_x$ .
  - **Union**(x, y): Une dois conjuntos
- **m** operações **FindSet**(x) e **Union**(x,y) consomem  **$O(m \log m)$**  unidades de tempo

# Consumo de tempo

**MST-Kruskal** ( $G, w$ )

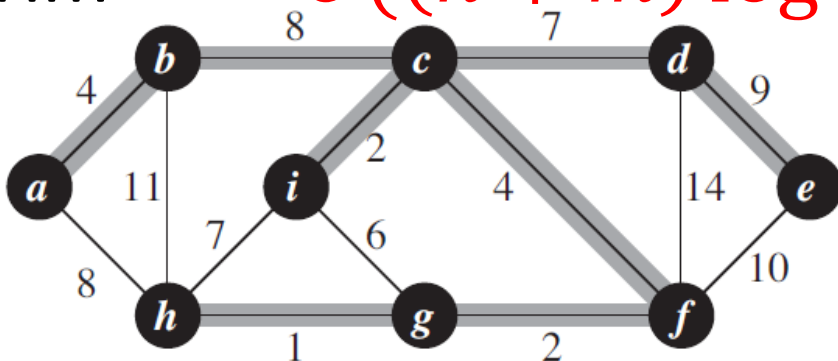
1	$T = \emptyset$	Consumo de tempo $O(1)$
2	para cada vértice $u$ em $G.V$ faça	$O(n)$
3	<b>MakeSet</b> ( $u$ )	$O(n) * O(1)$
4	ordenar arestas $G.E$ por peso (crescente)	$O(m \log m)$
5	para cada aresta $uv$ em $G.E$ (ordenada) faça	$O(m)$
6	se <b>FindSet</b> ( $u$ ) $\neq$ <b>FindSet</b> ( $v$ )	$O(m \log m)$
7	entao <b>Union</b> ( $u, v$ )	
8	$T = T \cup \{uv\}$	$O(m) * O(1)$
9	devolva $T$	$O(1)$

**Total:**

$$T(n, m) = O(m \log m)$$

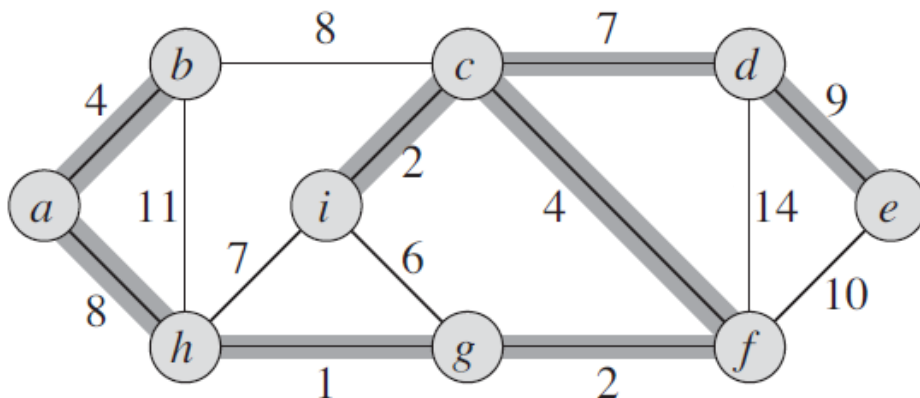
# Aula passada: Prim vs Kruskal

- Prim  $O((n + m) \log n)$



$$w(T) = 4 + 8 + 7 + 9 + \\ + 4 + 2 + 1 + 2 = 37$$

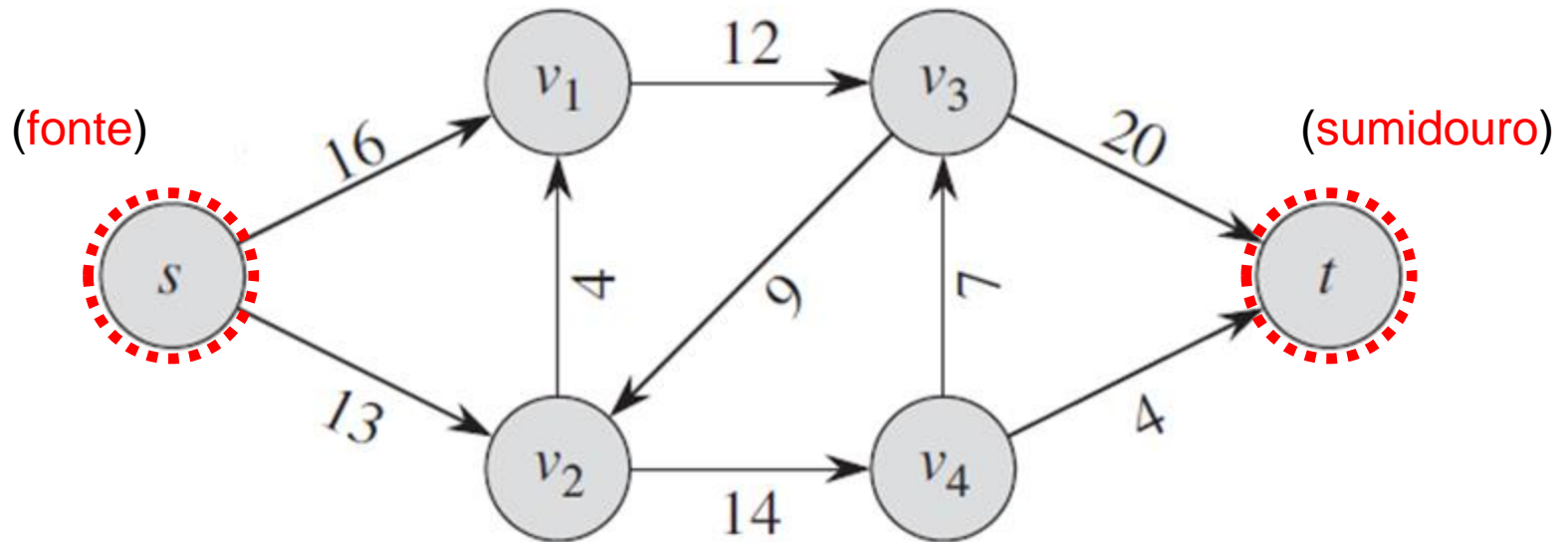
- Kruskal  $O(m \log m)$



$$w(T) = 1 + 2 + 2 + 4 + \\ + 4 + 7 + 8 + 9 = 37$$

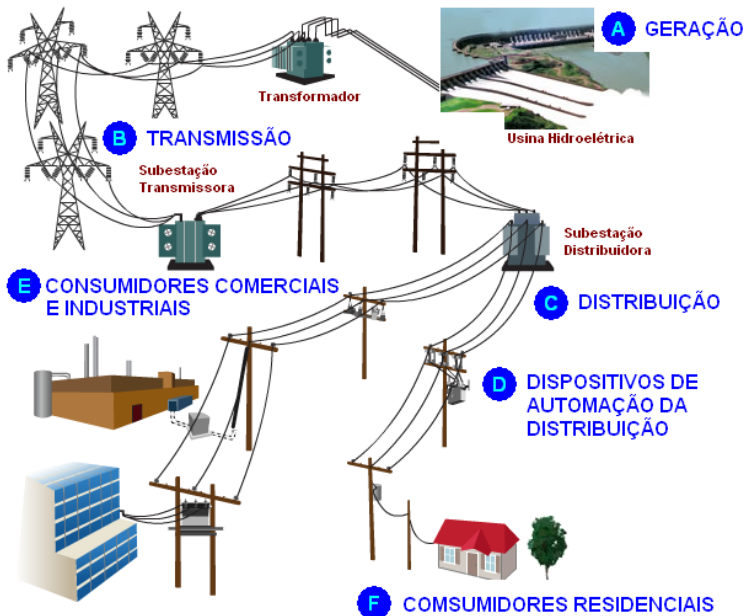
# Hoje

- **Problema:** Qual é o **fluxo máximo** de **s** a **t**?



# Fluxo máximo

- Exemplos:
  - informação
  - corrente elétrica
  - líquido, mercadoria, etc



# Fluxo máximo

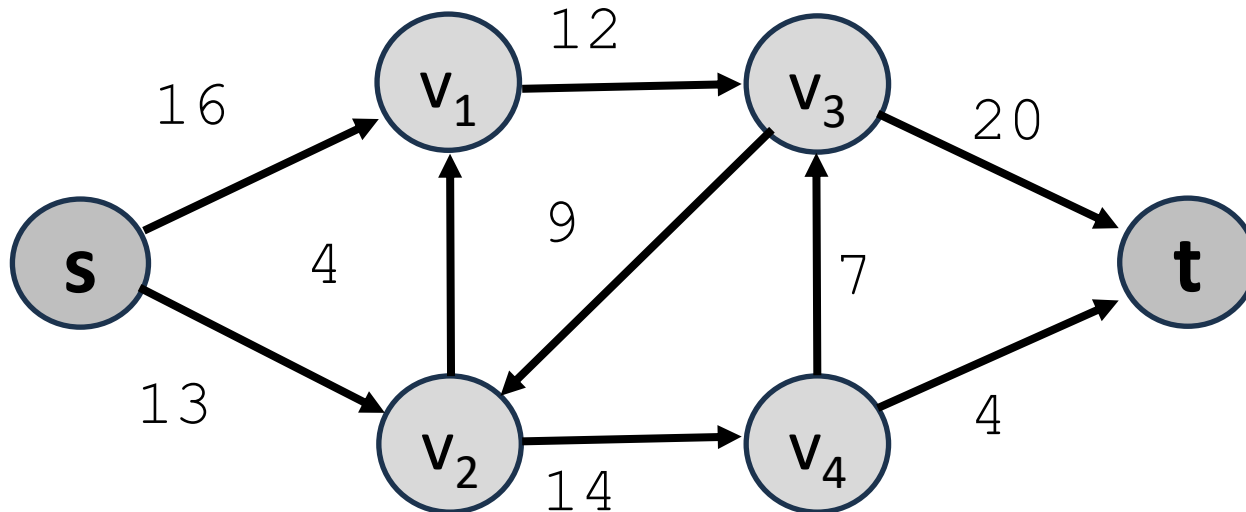
- Ford-Fulkerson
  - Fluxo / Capacidade
  - Caminho aumentante
  - Rede residual



# Exemplo

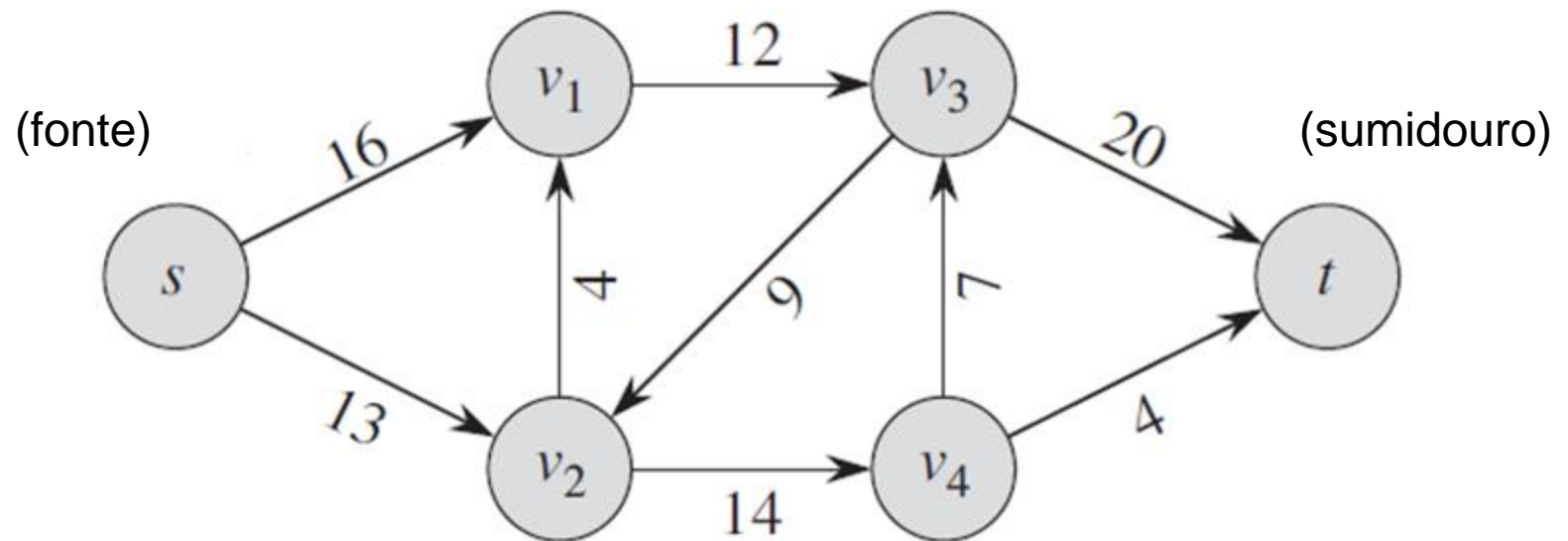
**Ford-Fulkerson-Method**( $G, s, t$ ) :

1. Inicialmente, fluxo  $\mathbf{f} = 0$
2. Enquanto existir um **caminho aumentante**  $\mathbf{P}$ :
3.       Incremente o fluxo  $\mathbf{f}$  (usando  $\mathbf{P}$ )
4. Devolva  $\mathbf{f}$



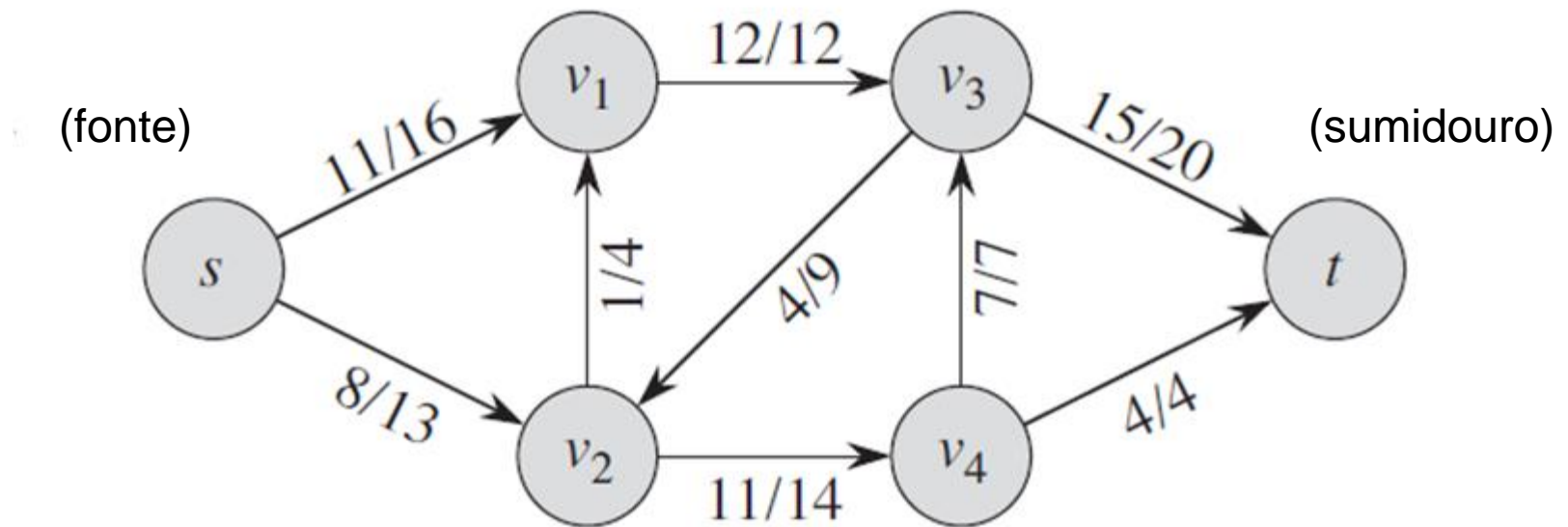
# Fluxo máximo?

- Capacidade



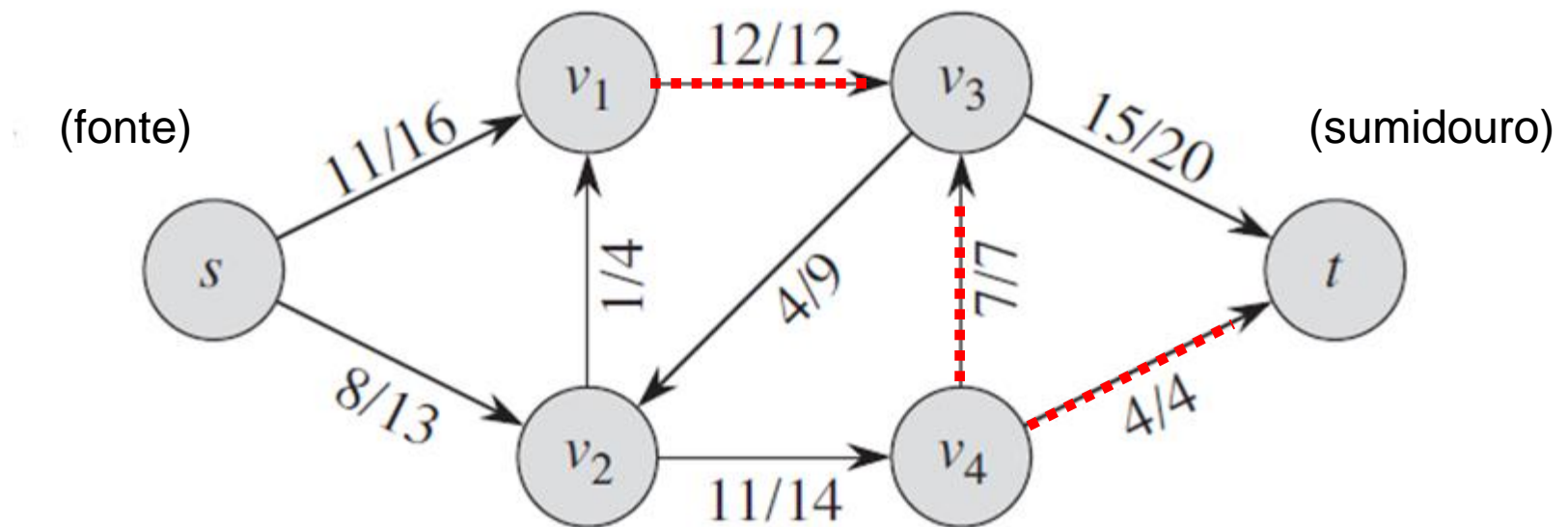
# Fluxo máximo?

- Fluxo vs Capacidade



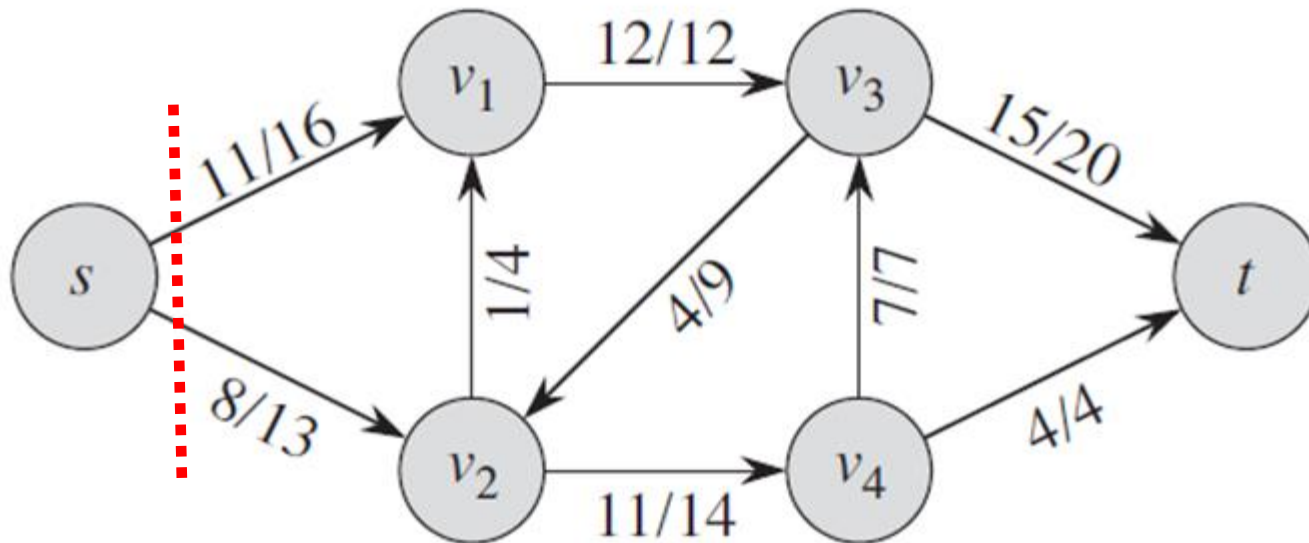
# Fluxo máximo?

- Fluxo vs Capacidade: **arcos saturados**



# Conservação do fluxo

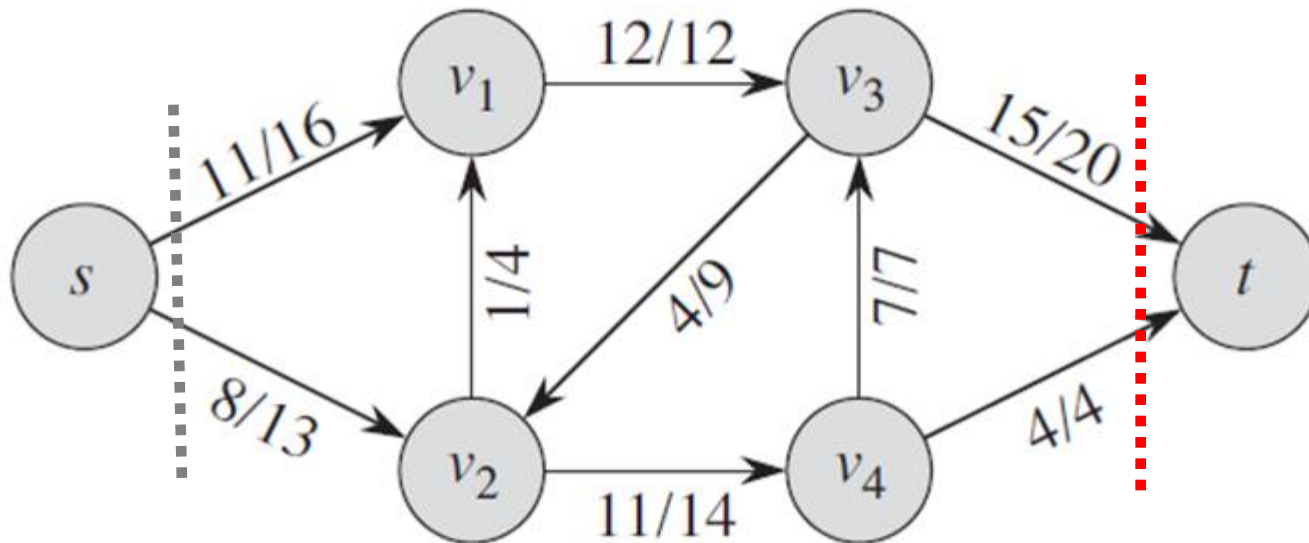
- Corte (S,T)



$$f = 11 + 8 = 19$$

# Conservação do fluxo

- Corte (S,T)

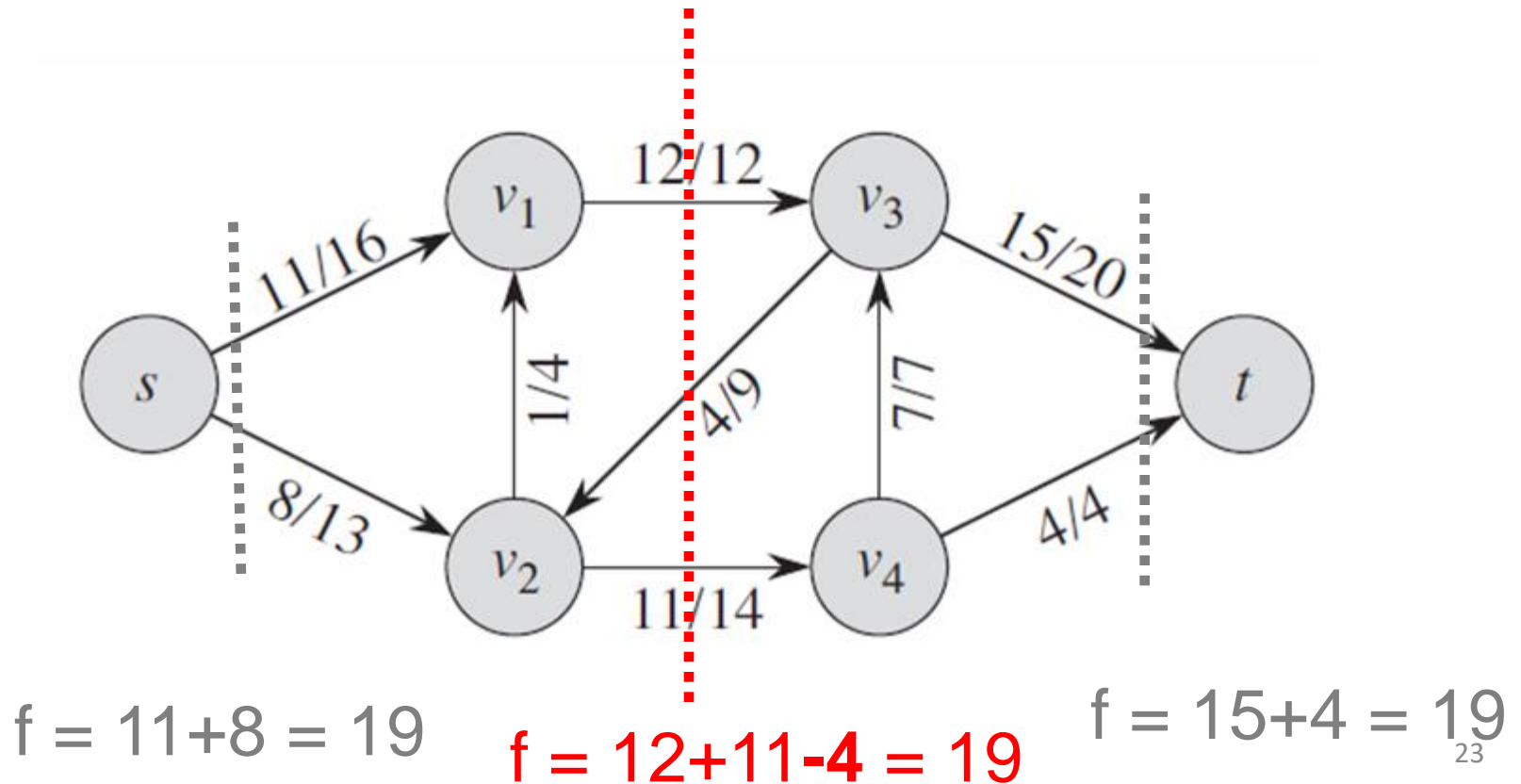


$$f = 11 + 8 = 19$$

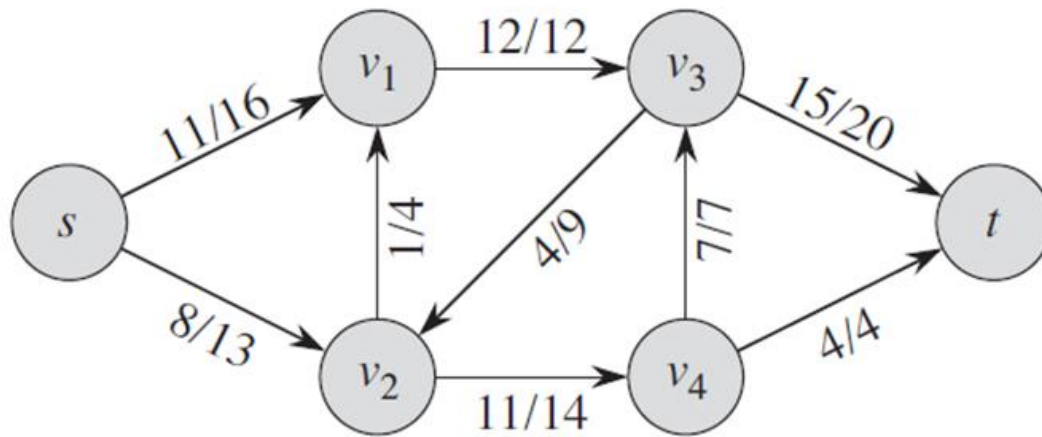
$$f = 15 + 4 = 19$$

# Conservação do fluxo

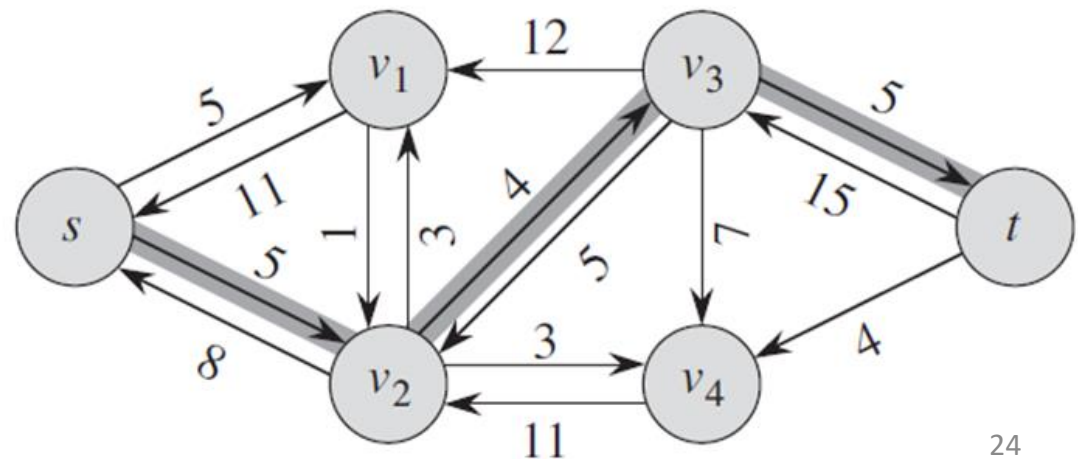
- Corte (S,T)



# Caminho **augmentante**



**original**



**residual**



# Exercícios Programas

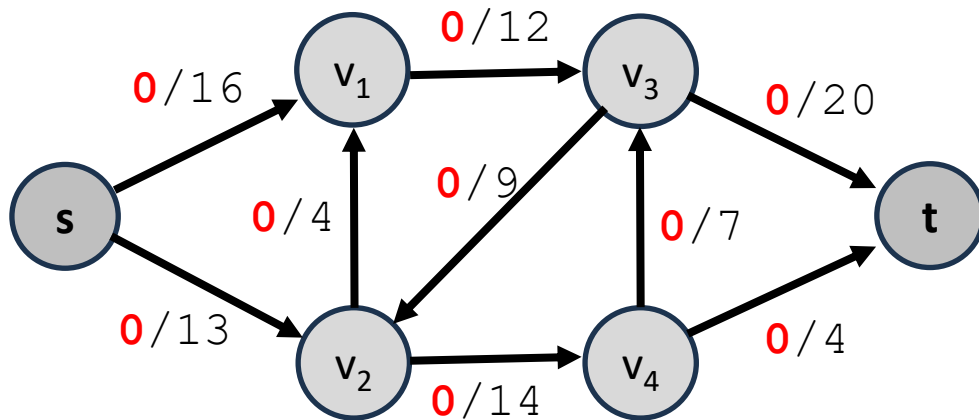
- 15-caminhoAumentante.py
- 16-aumentaFluxo.py

# Algoritmo

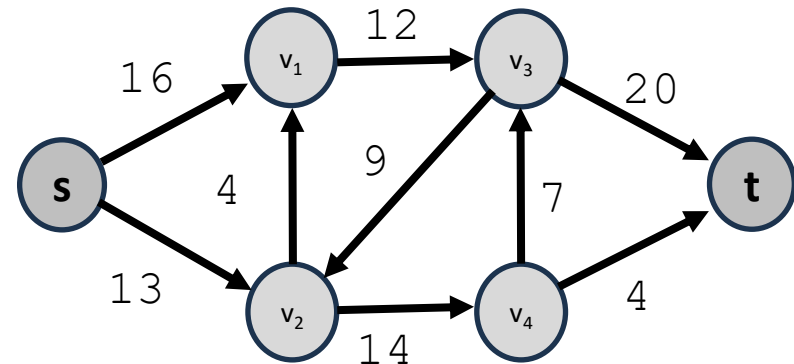
- Ford-Fulkerson( $G, s, t$ )
  - Entrada: um grafo **G** ponderado, um vértice inicial **s** e um vértice final **t**
  - Saída: **fluxo máximo** de **s** até **t**
- Atributo (arco)
  - $uv.f$ : fluxo

## Ford-Fulkerson( $G, s, t$ ):

1. para cada aresta  $uv$  em  $G.E$
2.  $uv.f = 0$
3. enquanto existir **caminho aumentante**  $P$  de  $s$  a  $t$ :
4. para cada  $uv$  em  $P$ :
5. se  $uv$  em  $G.E$ :
6.  $uv.f = uv.f + cf(P)$  # ida
7. senão:
8.  $vu.f = vu.f - cf(P)$  # volta

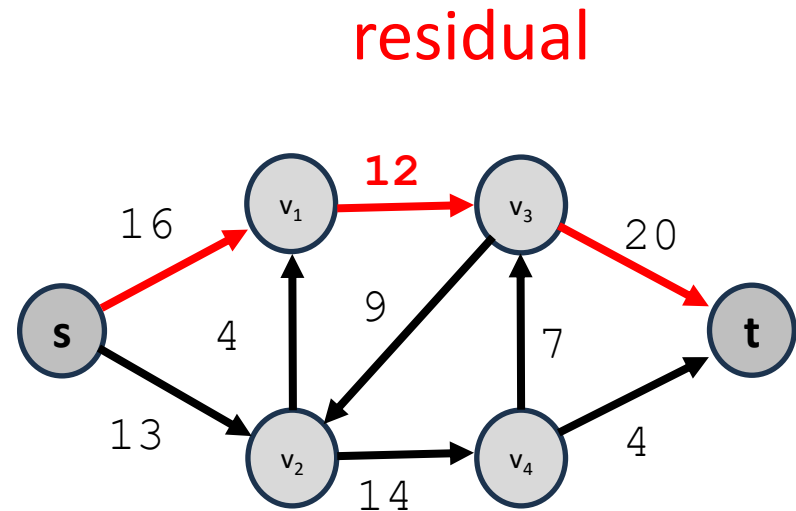
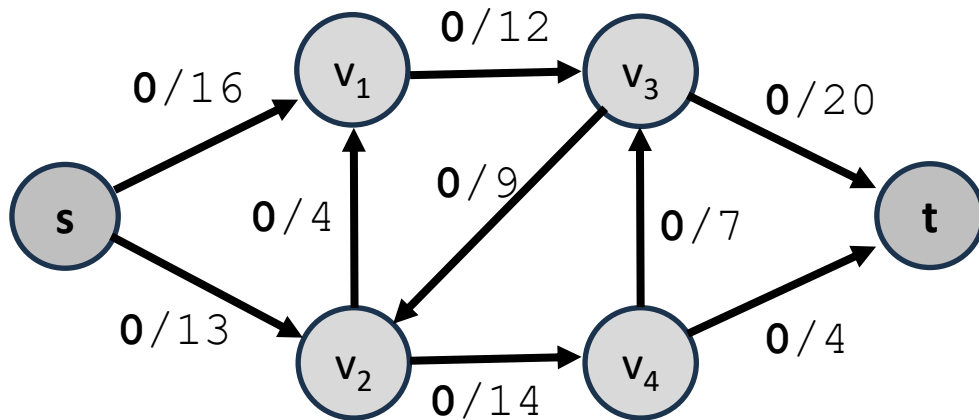


residual



**Ford-Fulkerson**( $G, s, t$ ):

1. para cada aresta  $uv$  em  $G.E$
2.  $uv.f = 0$
3. enquanto existir **caminho aumentante**  $P$  de  $s$  a  $t$ :
4. para cada  $uv$  em  $P$ :
5. se  $uv$  em  $G.E$ :
6.  $uv.f = uv.f + cf(P)$  # ida
7. senão:
8.  $vu.f = vu.f - cf(P)$  # volta



**Ford-Fulkerson**( $G, s, t$ ):

1. para cada aresta  $uv$  em  $G.E$

2.  $uv.f = 0$

3. enquanto existir **caminho aumentante**  $P$  de  $s$  a  $t$ :

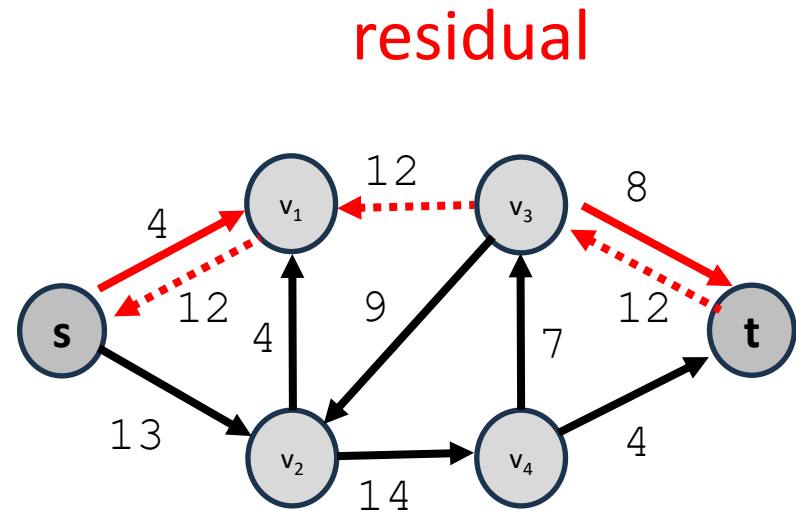
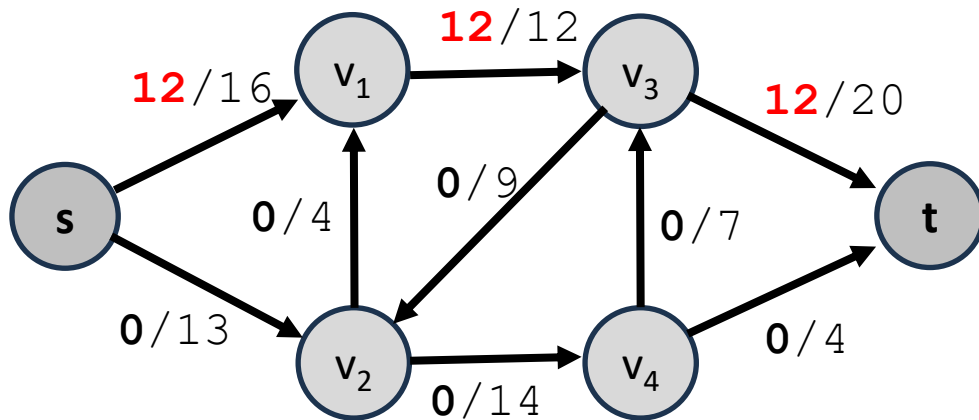
4. para cada  $uv$  em  $P$ :

5. se  $uv$  em  $G.E$ :

6.  $uv.f = uv.f + cf(P)$  # ida

7. senão:

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**Ford-Fulkerson**( $G, s, t$ ):

1. para cada aresta  $uv$  em  $G.E$

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3. enquanto existir **caminho aumentante**  $P$  de  $s$  a  $t$ :

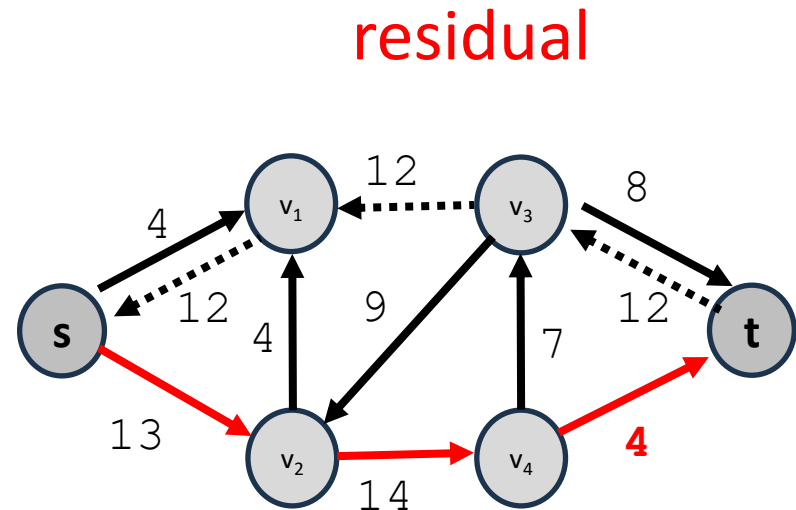
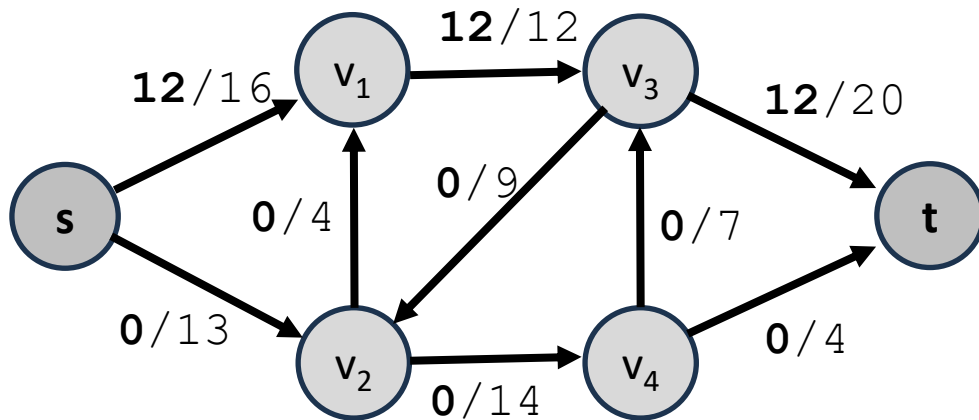
4. para cada  $uv$  em  $P$ :

5. se  $uv$  em  $G.E$ :

6.  $uv.f = uv.f + cf(P)$  # ida

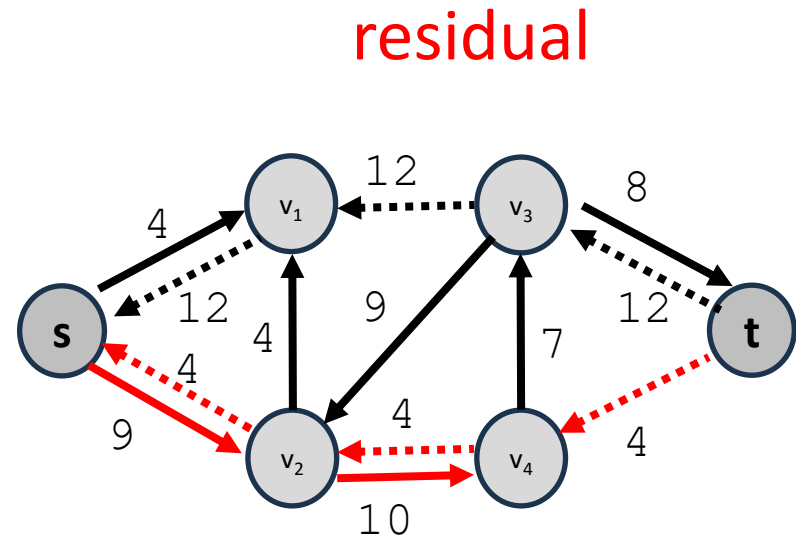
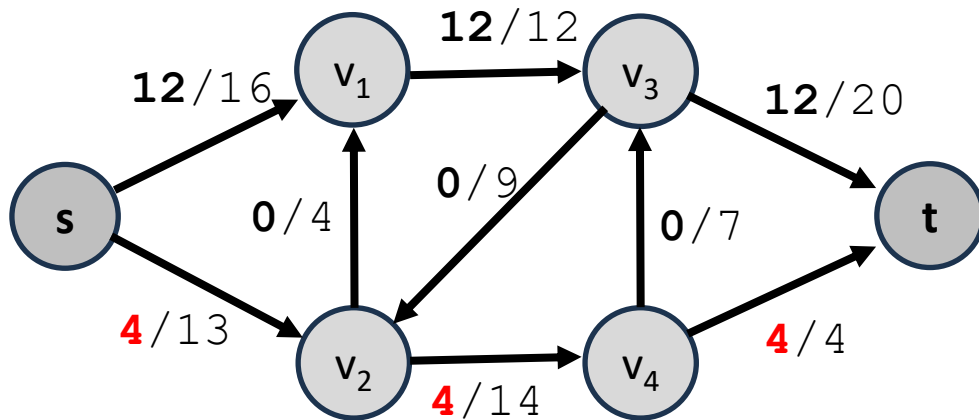
7. senão:

8.  $vu.f = vu.f - cf(P)$  # volta



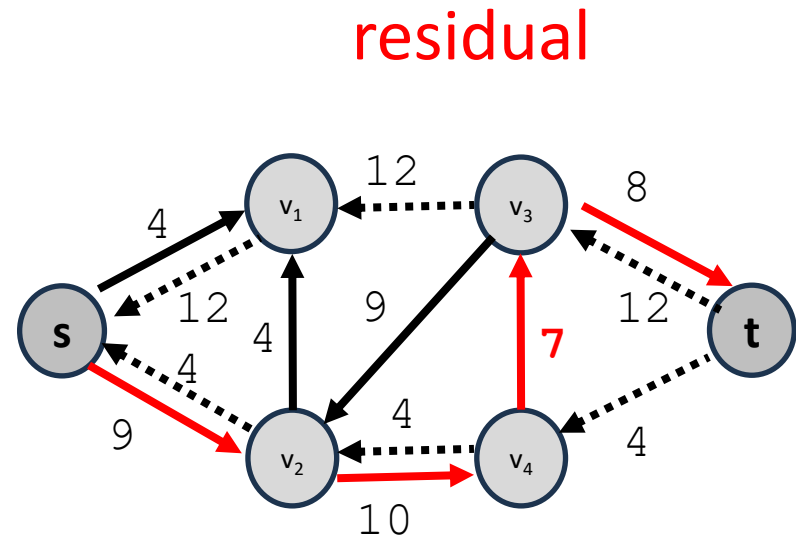
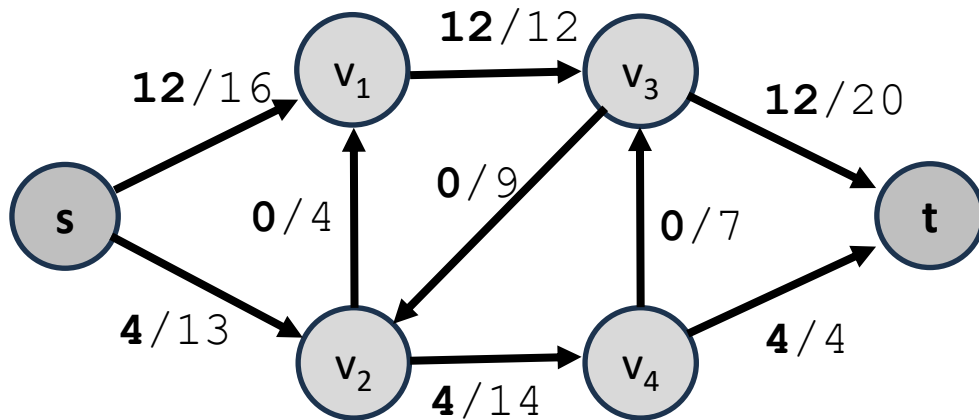
**Ford-Fulkerson**( $G, s, t$ ):

1. para cada aresta  $uv$  em  $G.E$
2.  $uv.f = 0$
3. enquanto existir **caminho aumentante**  $P$  de  $s$  a  $t$ :
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5. se  $uv$  em  $G.E$ :
6.  $uv.f = uv.f + cf(P)$  # ida
7. senão:
8.  $vu.f = vu.f - cf(P)$  # volta



**Ford-Fulkerson**(G, s, t) :

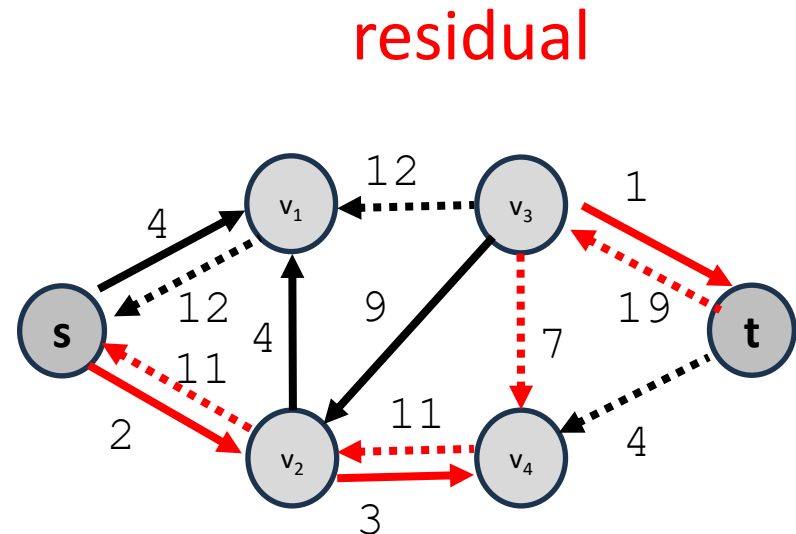
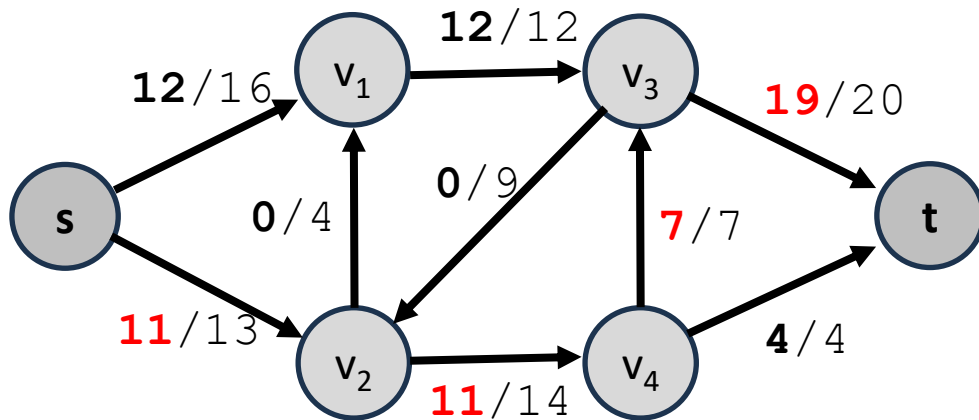
1. para cada aresta  $uv$  em  $G.E$
2.  $uv.f = 0$
3. enquanto existir **caminho aumentante**  $P$  de  $s$  a  $t$ :
4. para cada  $uv$  em  $P$ :
5. se  $uv$  em  $G.E$ :
6.  $uv.f = uv.f + cf(P)$  # ida
7. senão:
8.  $vu.f = vu.f - cf(P)$  # volta





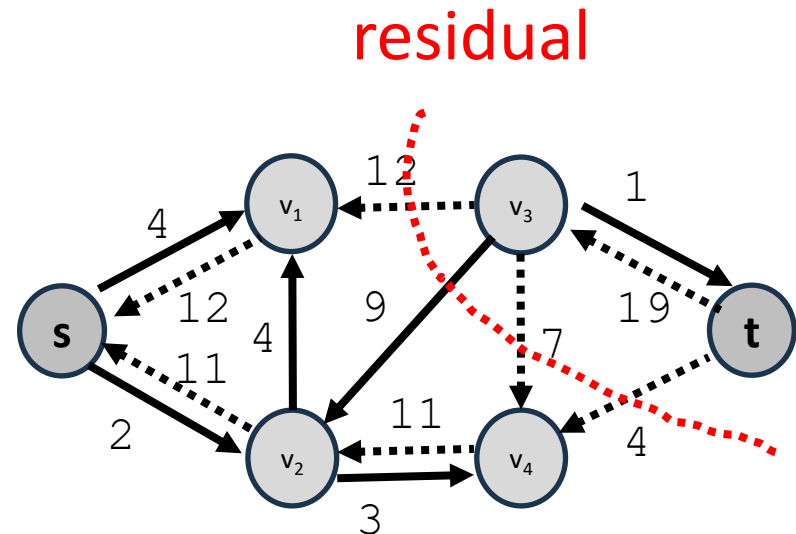
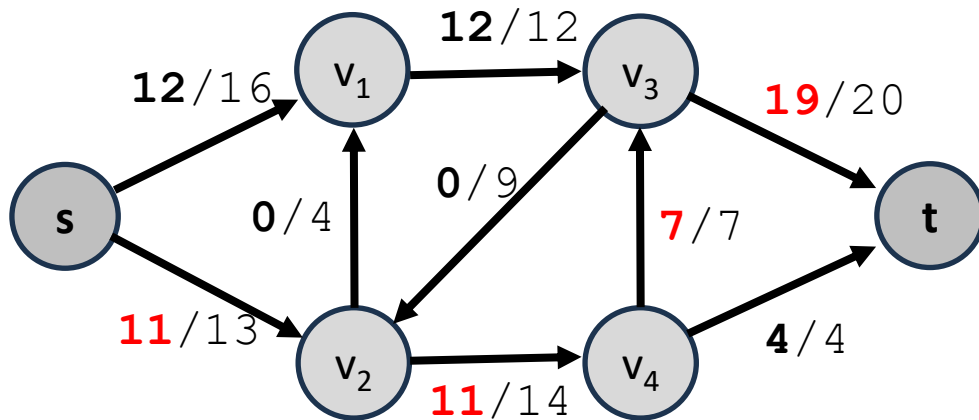
**Ford-Fulkerson**( $G, s, t$ ):

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4. para cada  $uv$  em  $P$ :
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6.  $uv.f = uv.f + cf(P)$  # ida
7. senão:
8.  $vu.f = vu.f - cf(P)$  # volta



**Ford-Fulkerson**(G, s, t) :

1. para cada aresta  $uv$  em  $G.E$
2.  $uv.f = 0$
3. enquanto existir **caminho aumentante**  $P$  de  $s$  a  $t$ :
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5. se  $uv$  em  $G.E$ :
6.  $uv.f = uv.f + cf(P)$  # ida
7. senão:
8.  $vu.f = vu.f - cf(P)$  # volta



**Ford-Fulkerson-Method**( $G, s, t$ ):

1. Inicialmente, fluxo  $\mathbf{f} = 0$

2. Enquanto existir um **caminho aumentante  $P$** :

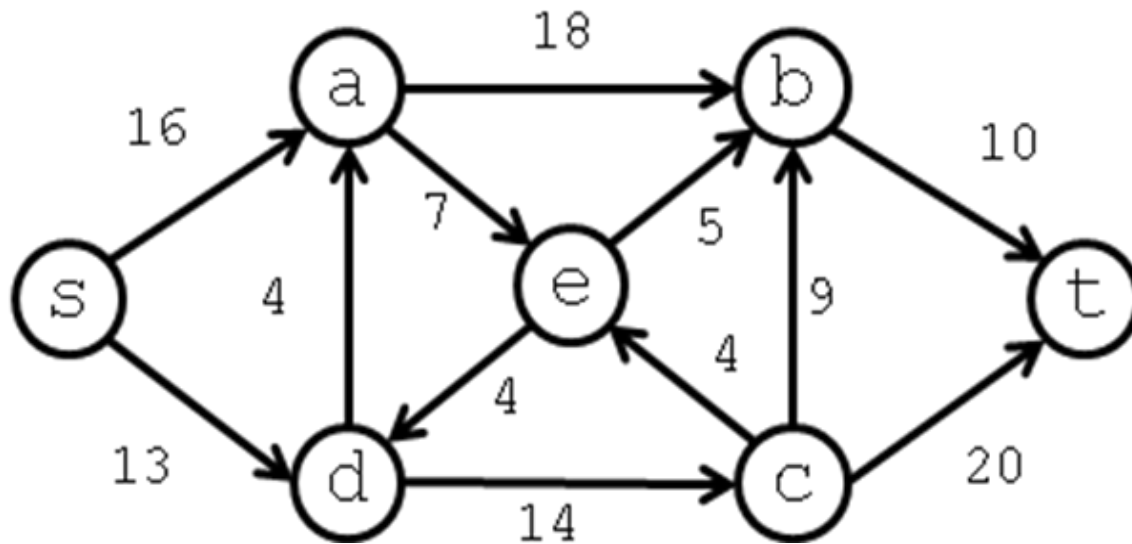
3.       Incremente o fluxo  $\mathbf{f}$  (usando  $P$ )

4. Devolva  $\mathbf{f}$

# Exercícios

- Simule o algoritmo de **Ford-Fulkerson** para calcular **fluxo máximo**:

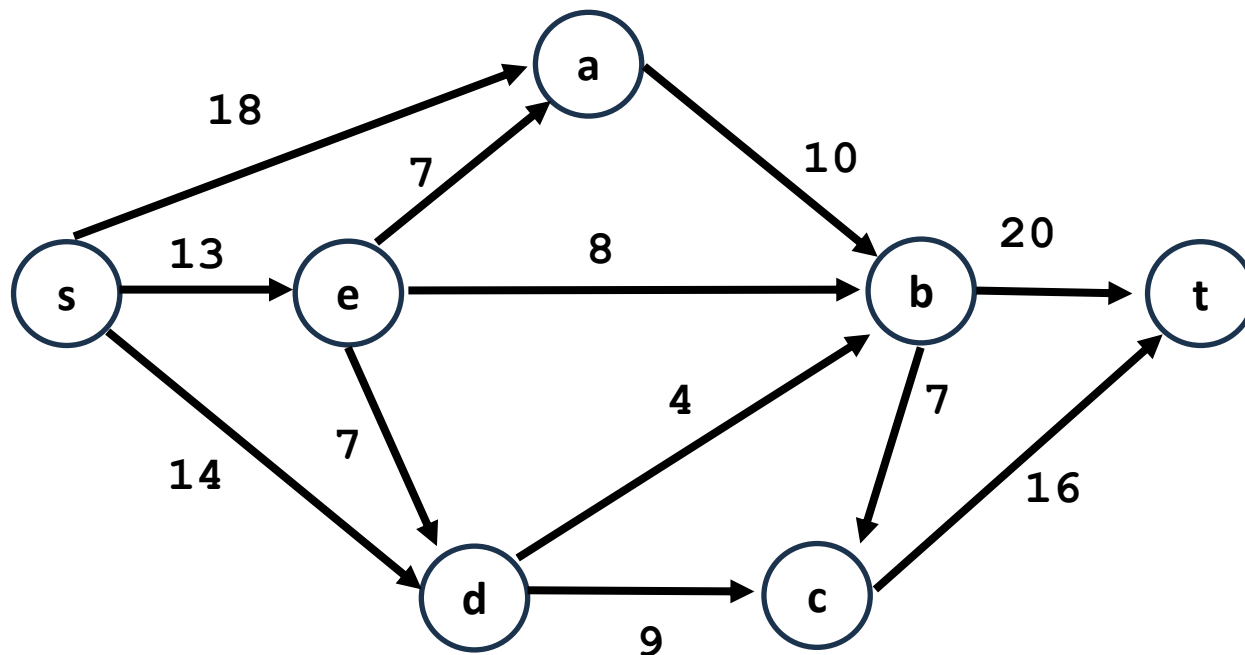
(a)



# Exercícios

- Simule o algoritmo de **Ford-Fulkerson** para calcular **fluxo máximo**:

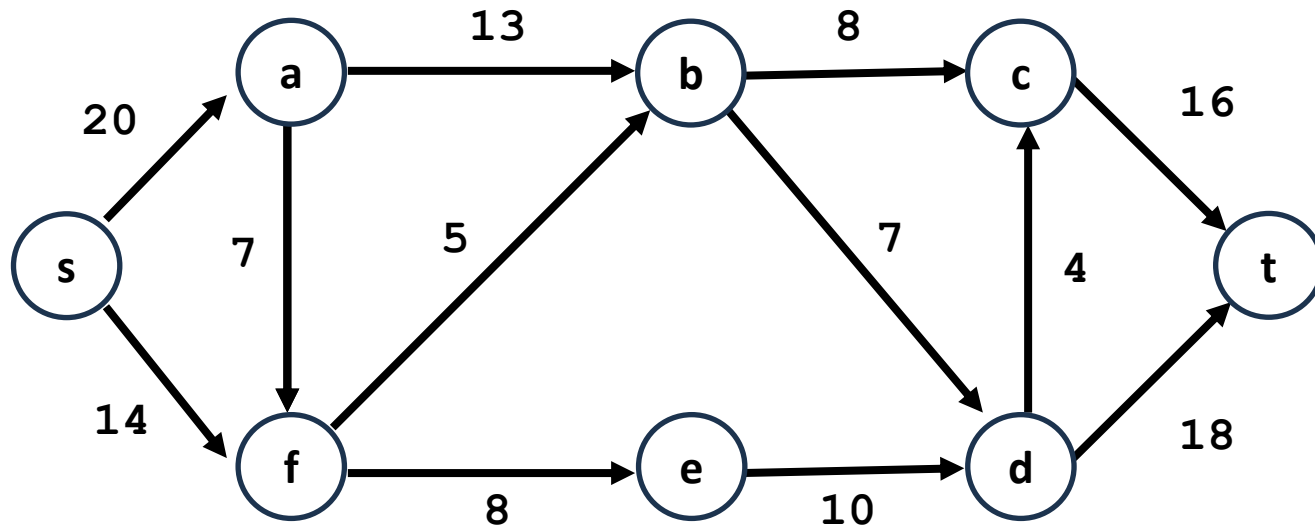
(b)



# Exercícios

- Simule o algoritmo de **Ford-Fulkerson** para calcular **fluxo máximo**:

(c)



# Exercício Programa

- 17-fluxoMaximo.py