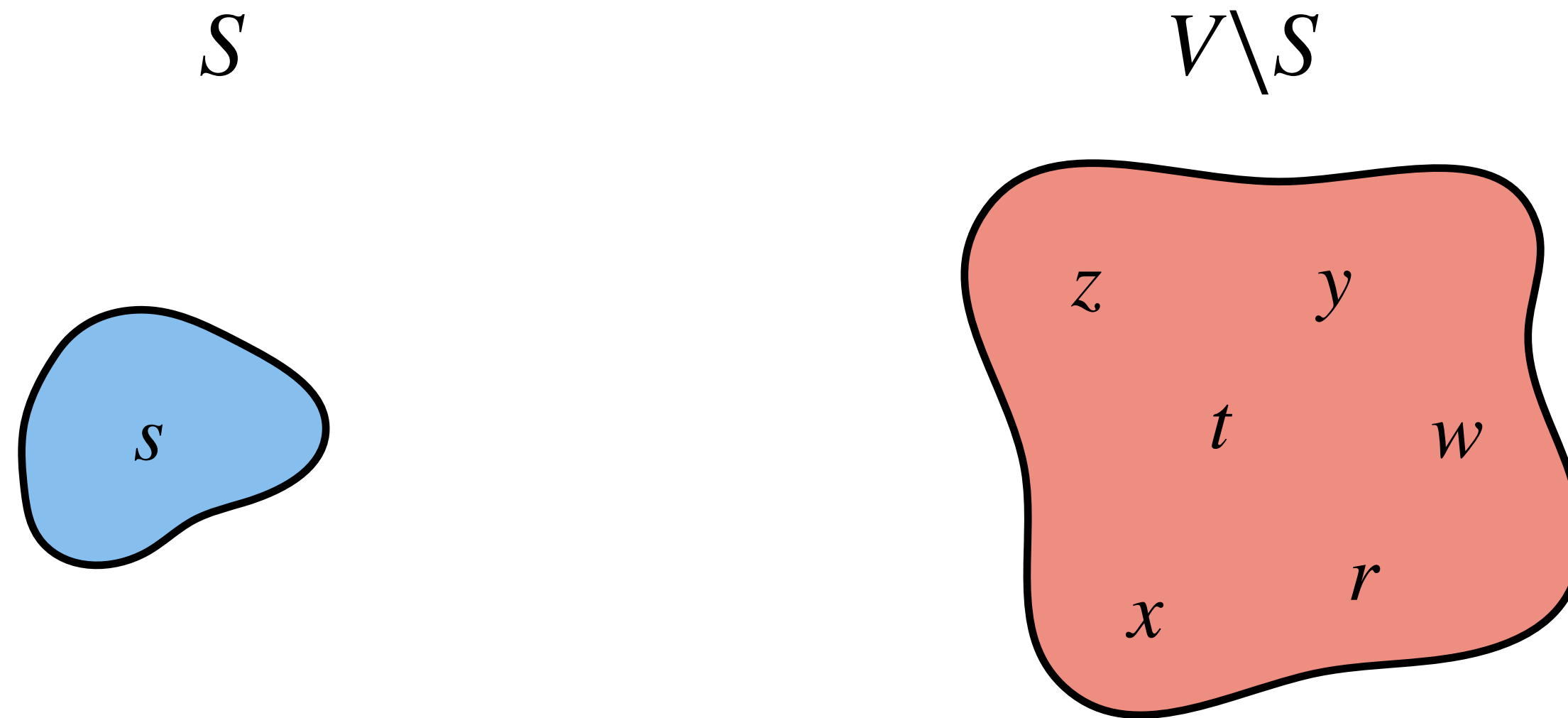


# Lecture 16

Dijkstra (contd.), Flow Networks

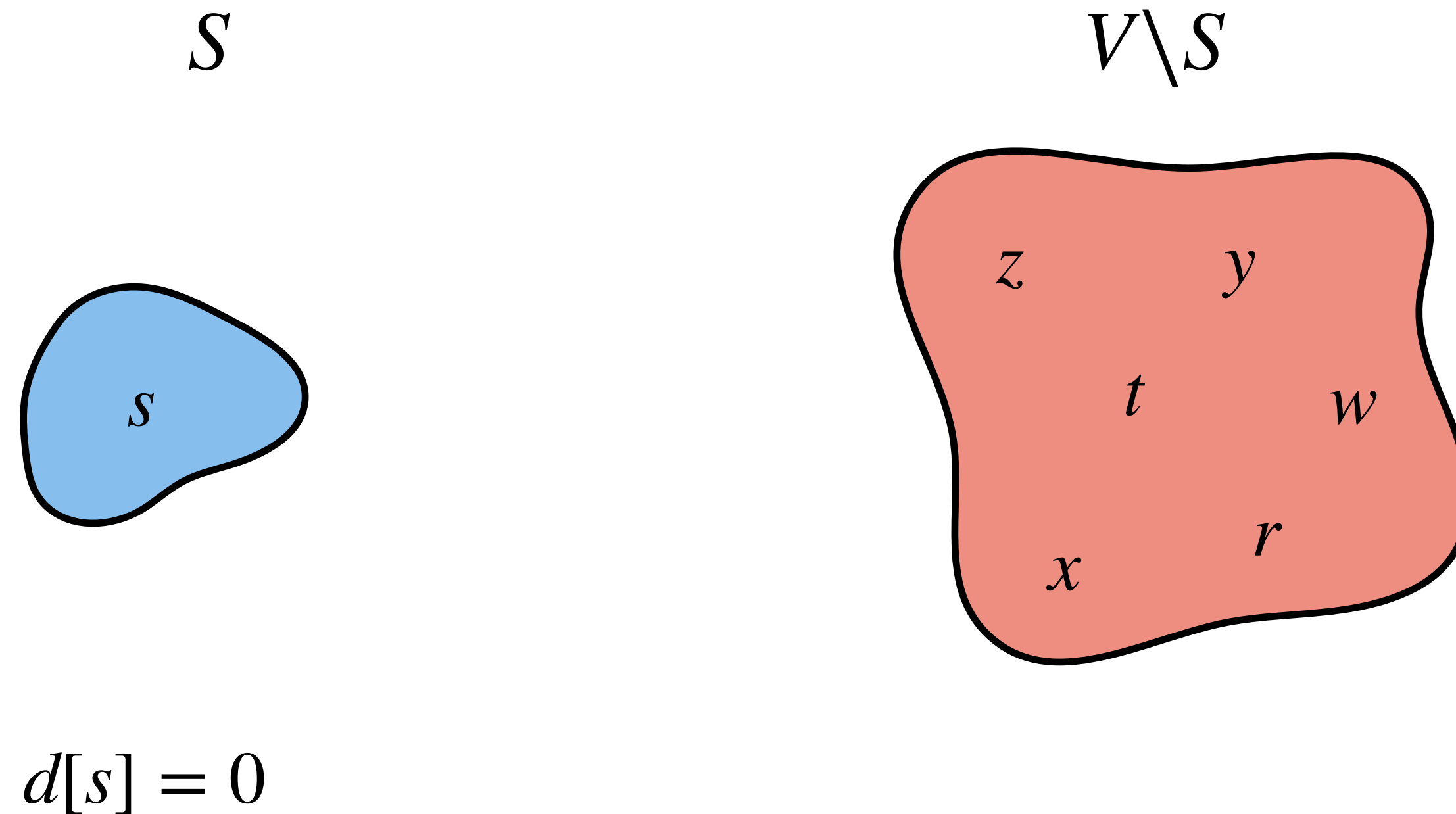
# Dijkstra's Algorithm: Optimization

Computed  $\pi[v]$  values in  $V \setminus S$  in an efficient way.



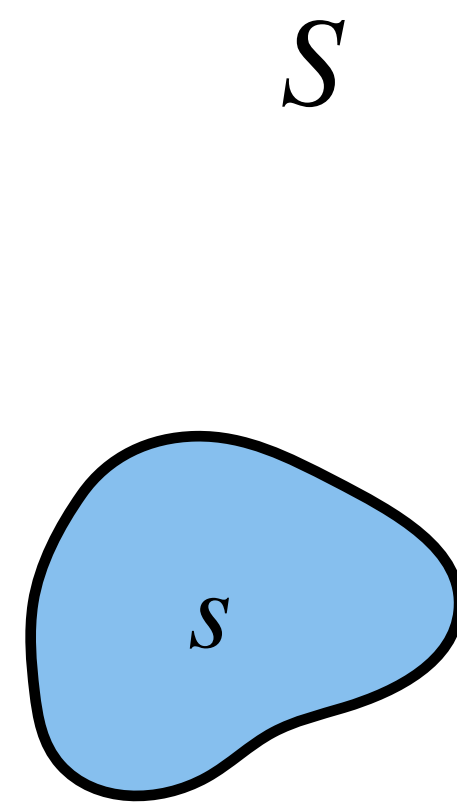
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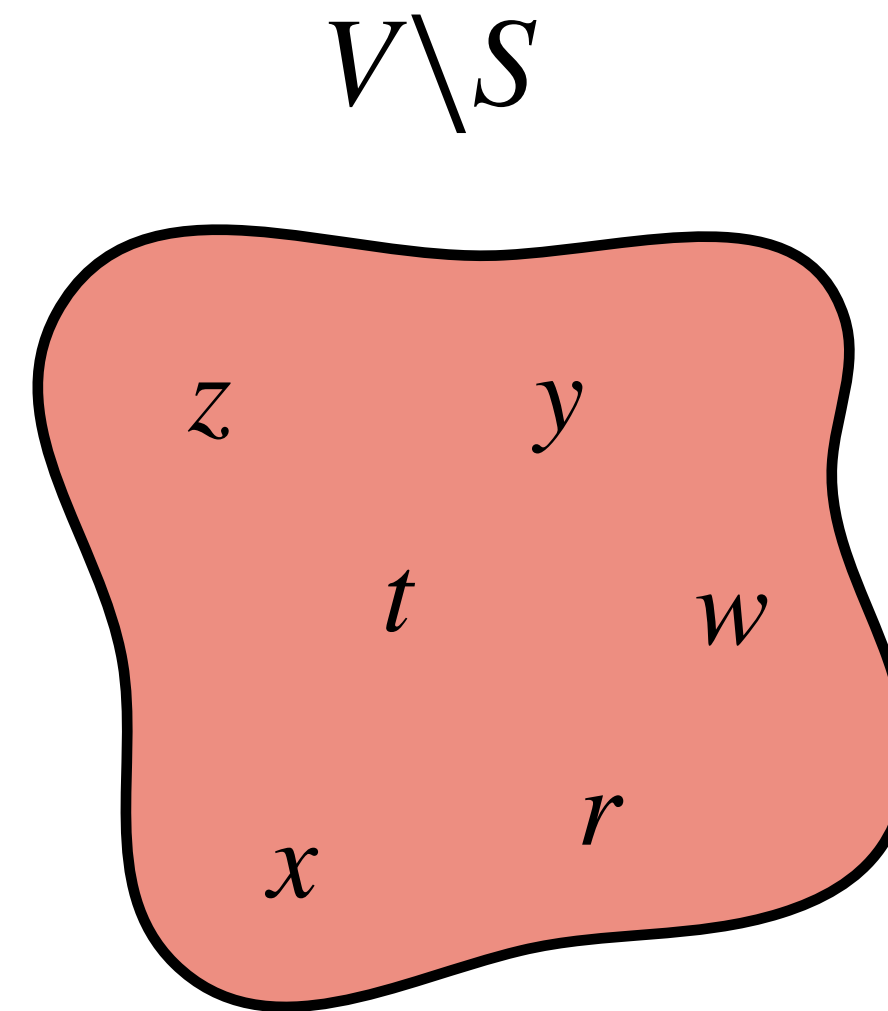


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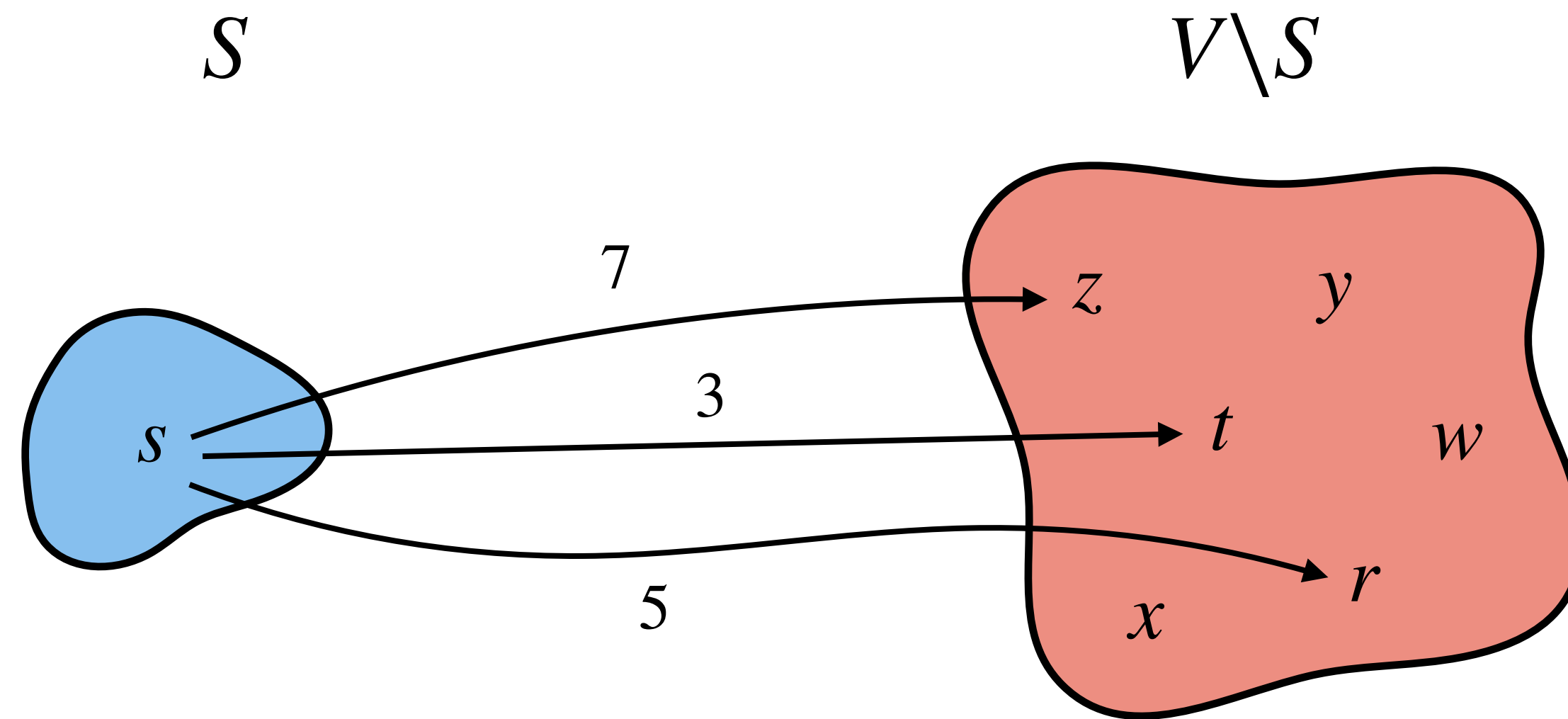


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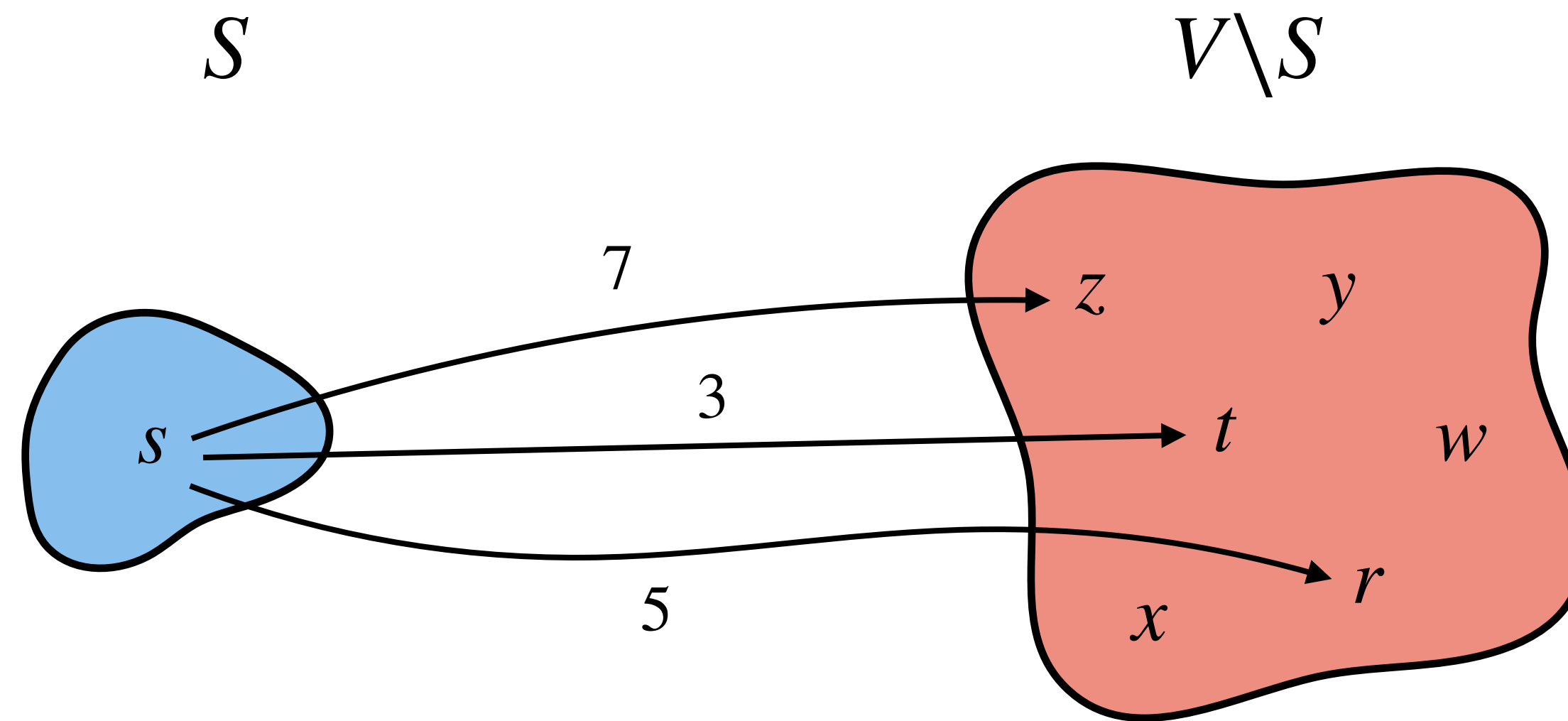
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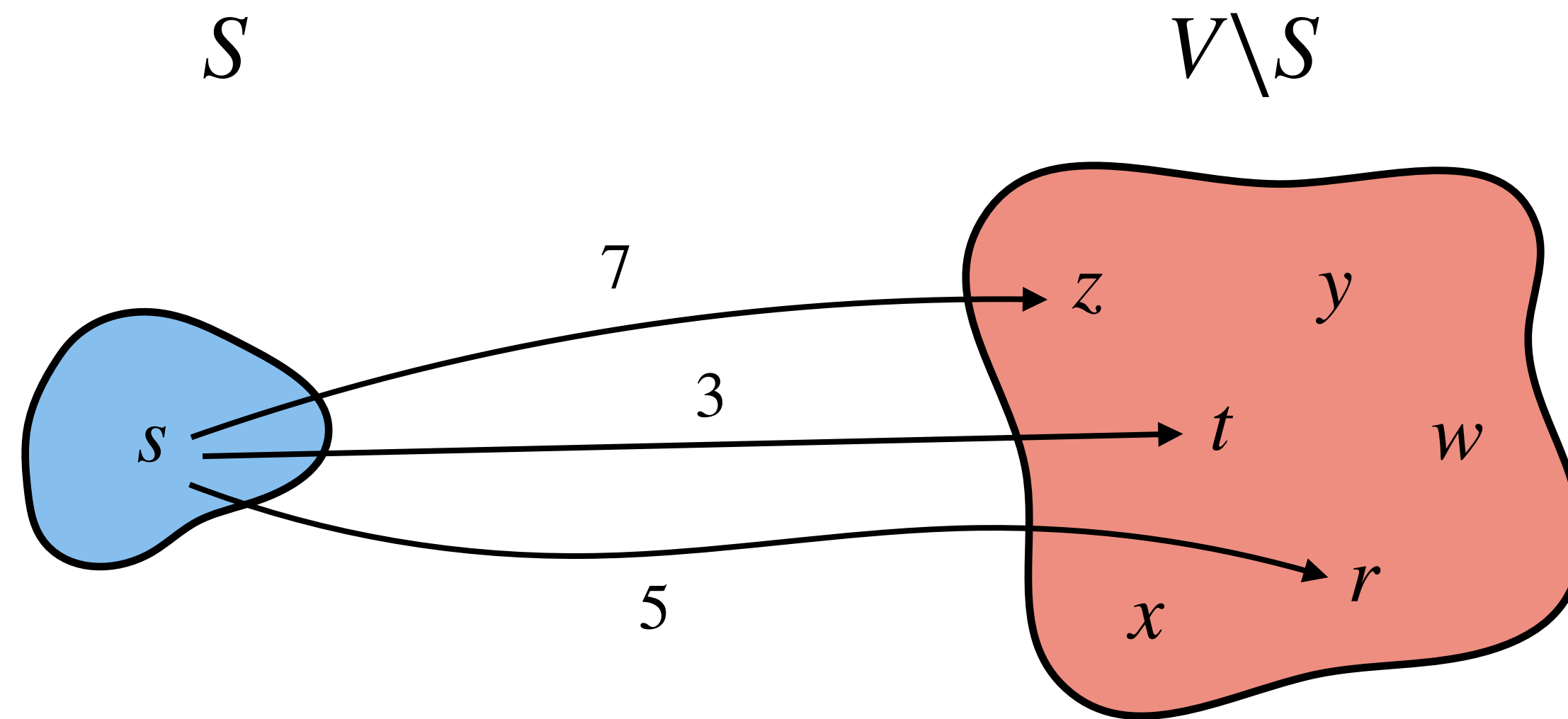
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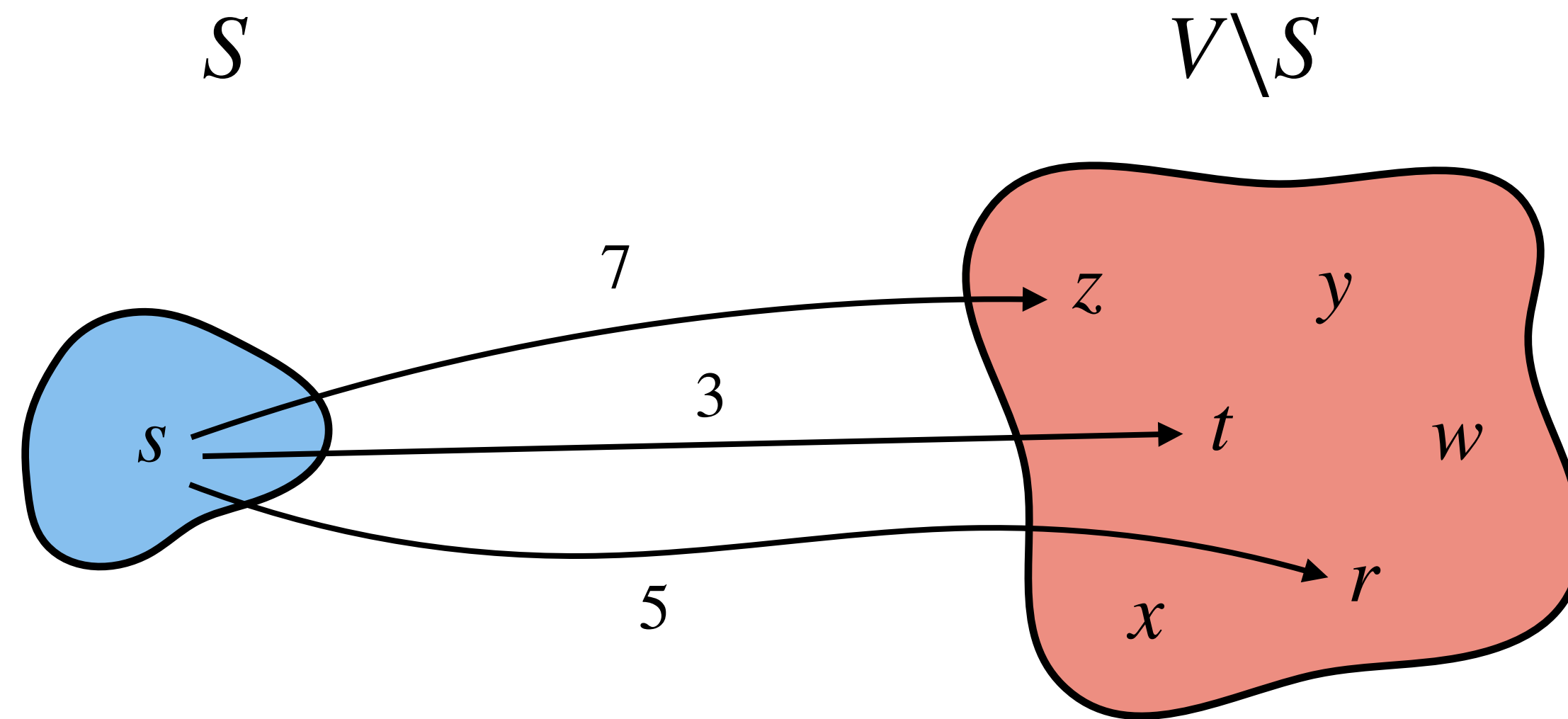
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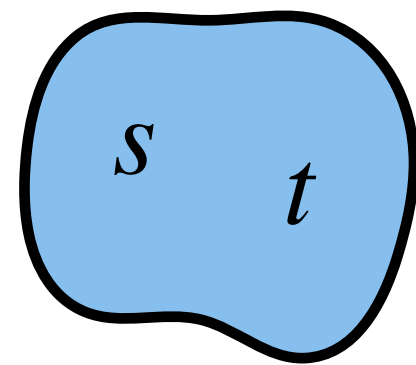
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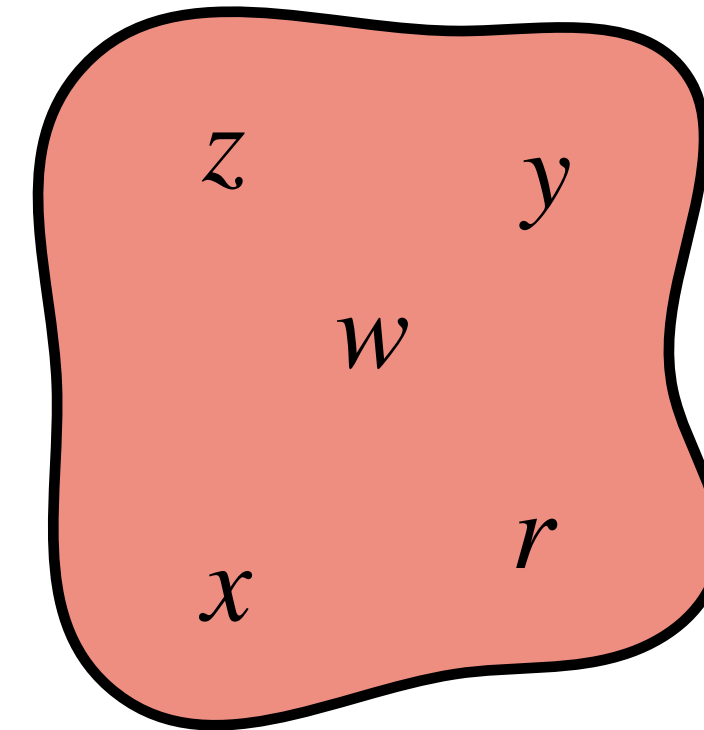
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$S$



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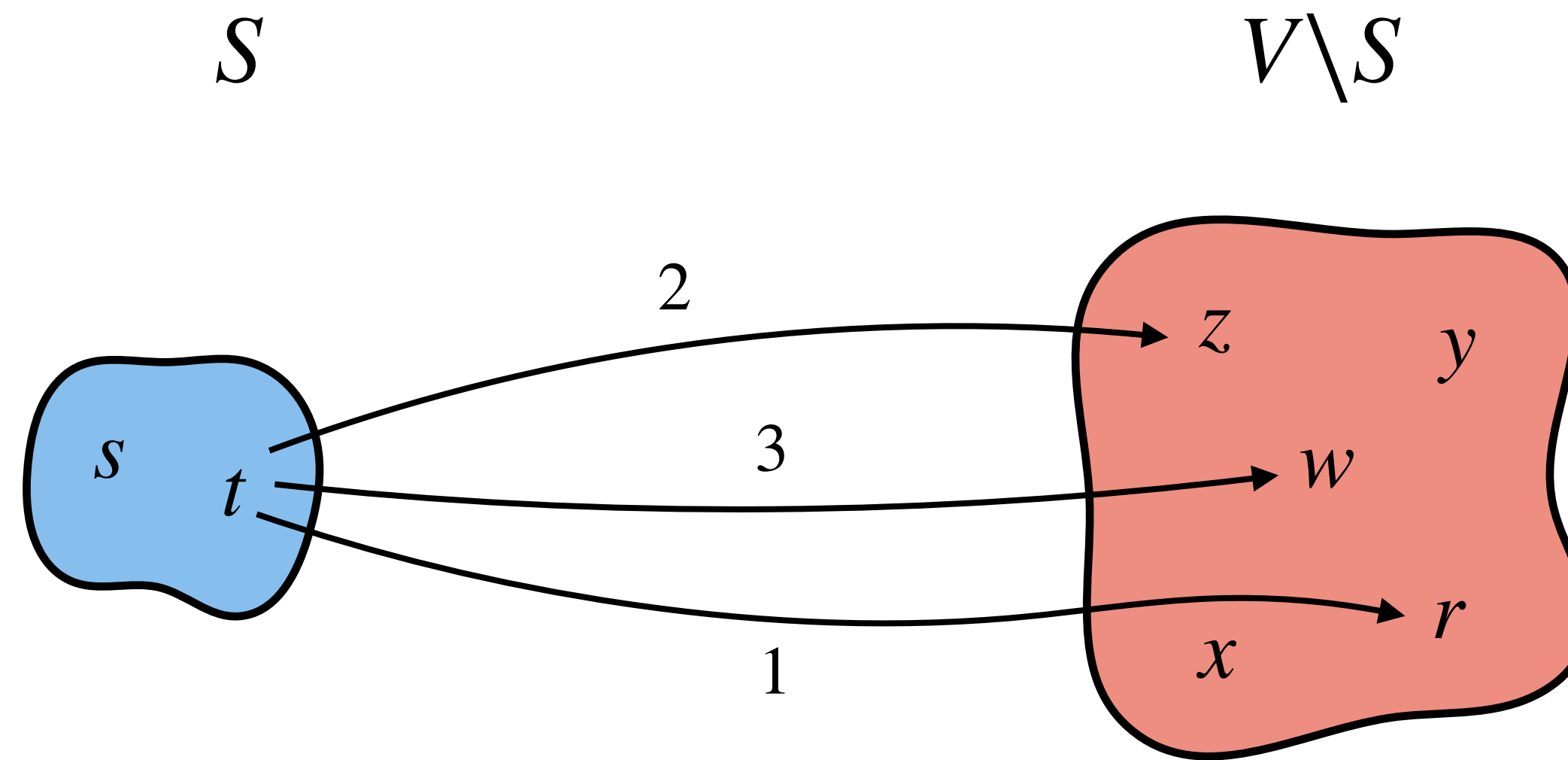


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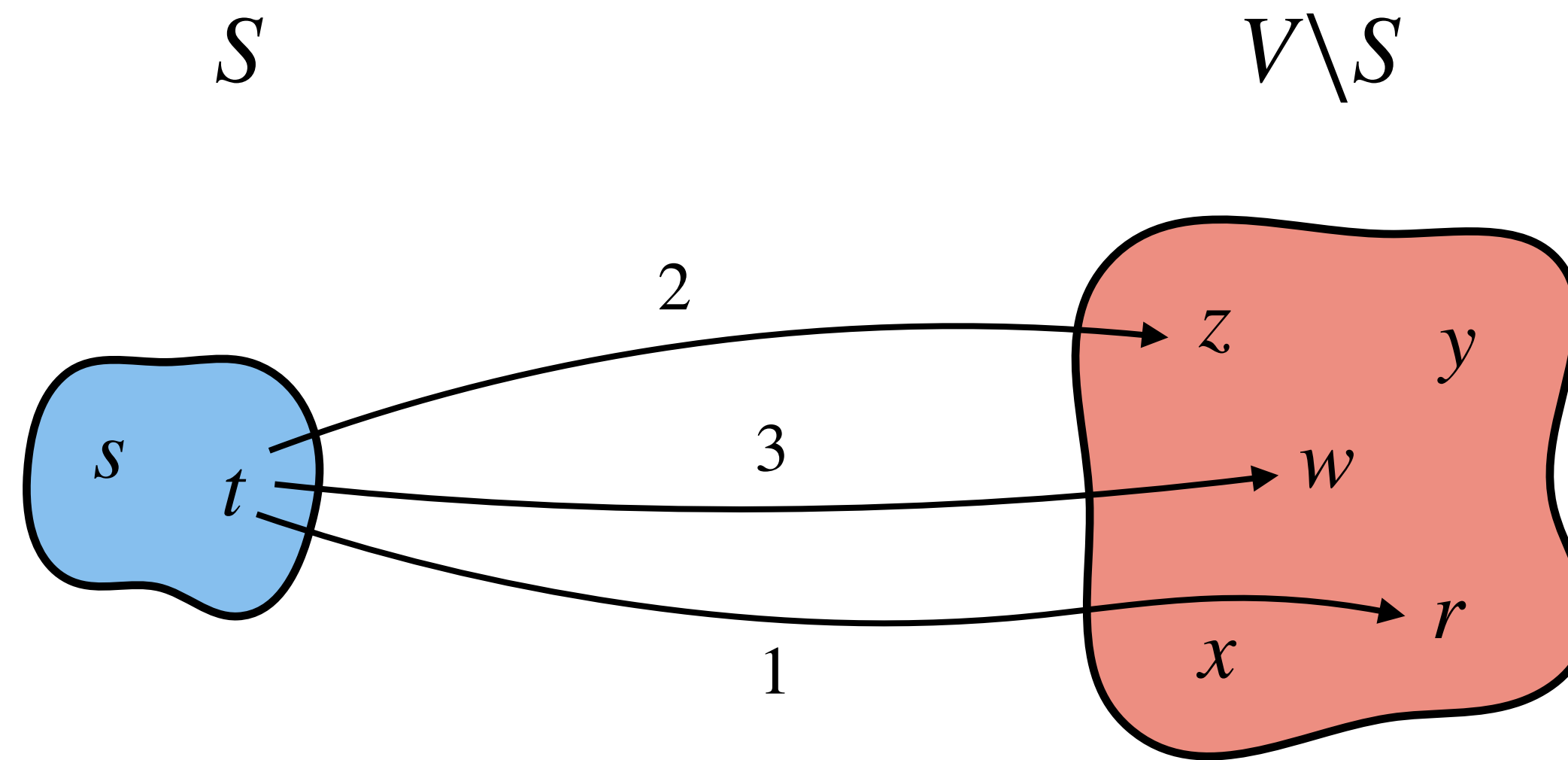
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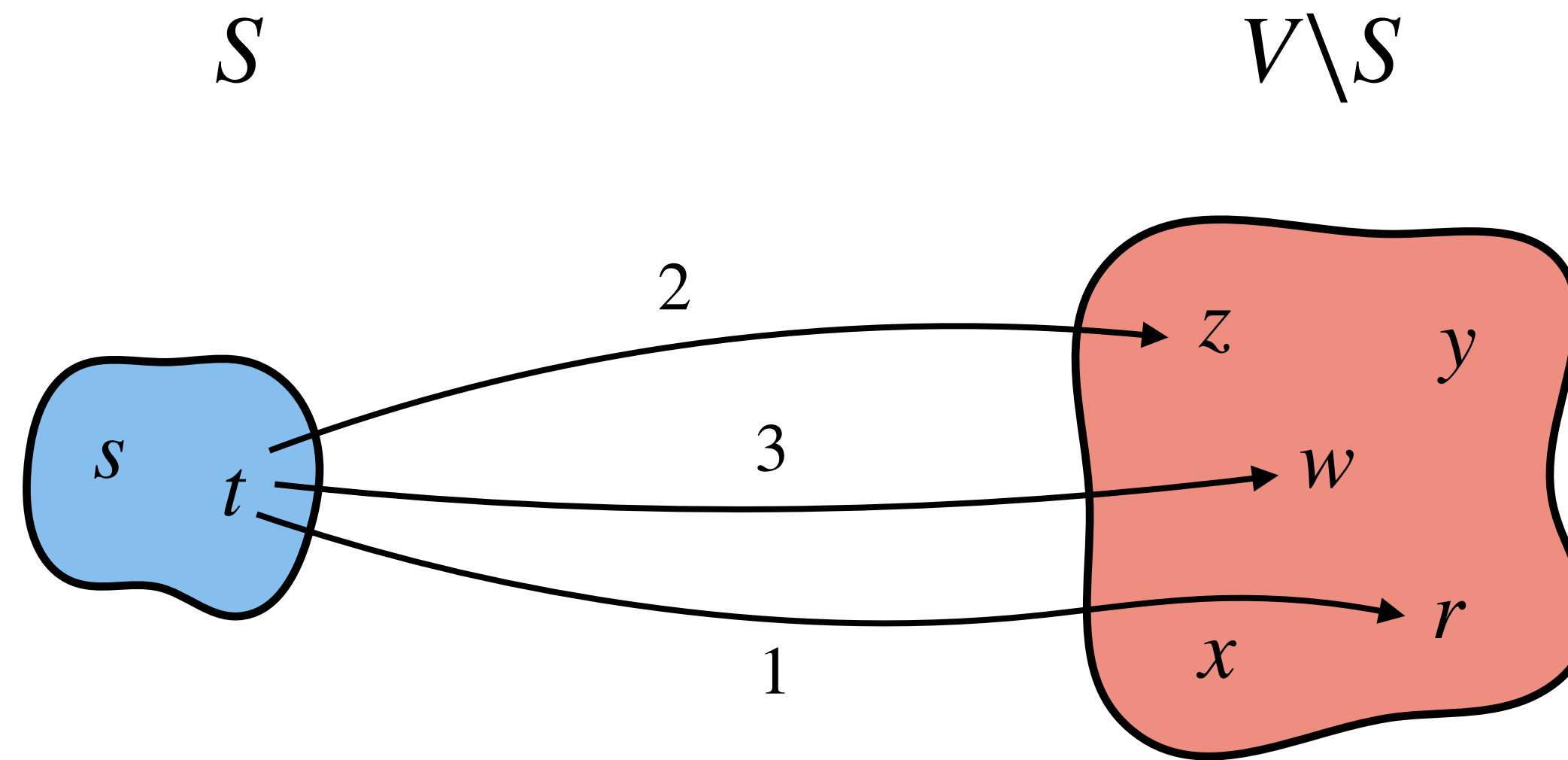
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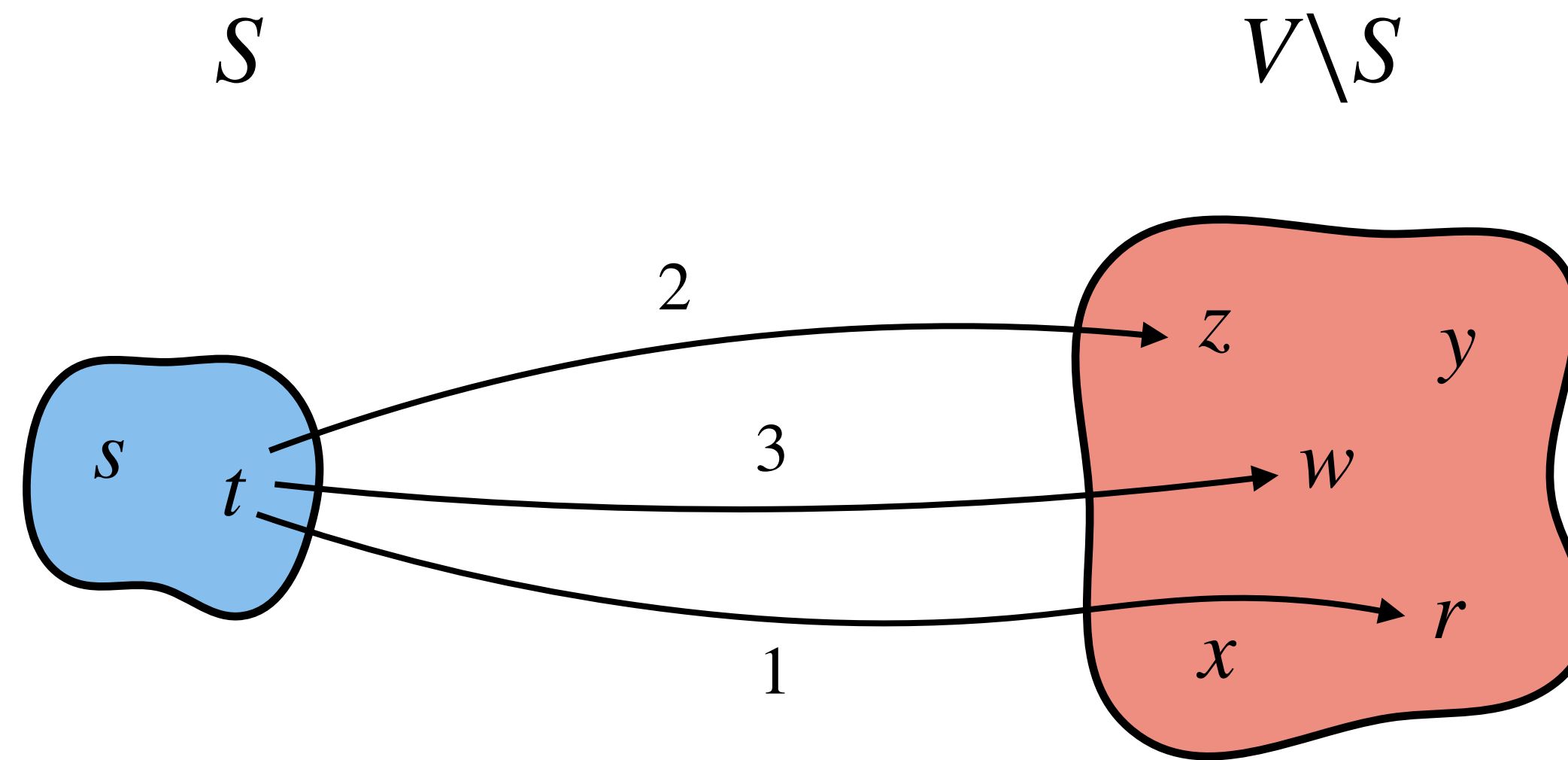
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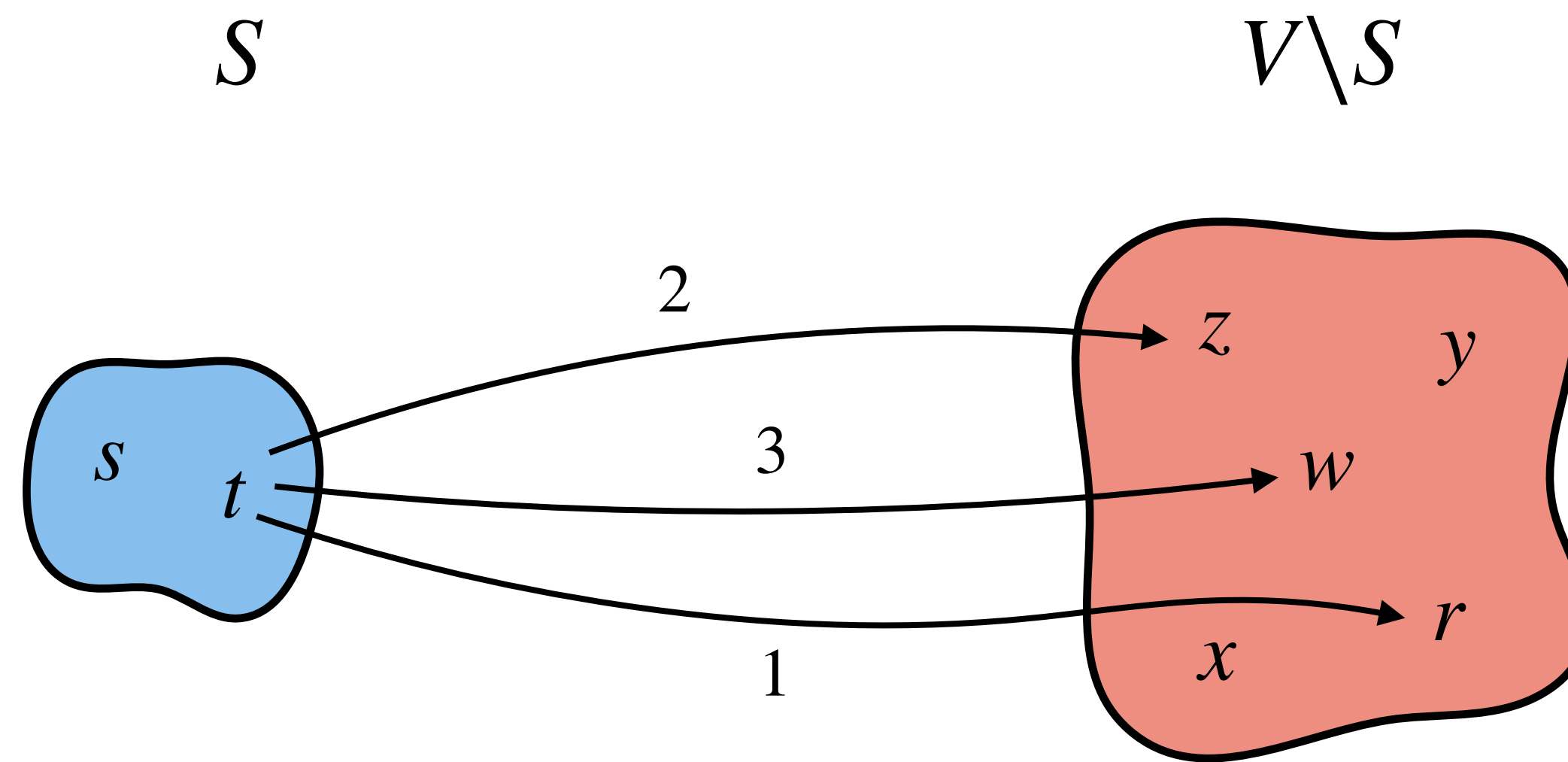
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What data structure is suitable to keep updating  $\pi$  values and removing the one with minimum?

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**Idea:** Form a min-priority queue of  $V \setminus S$  where *keys* are  $\pi$  values.

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What if  $v \in S$ ? Then line 10 condition will be false as  $\pi[v]$  became  $\delta(s, v)$  earlier and cannot further decrease.

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Condition of line 10 will be false.

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- You can produce **shortest paths** as well not just distance.



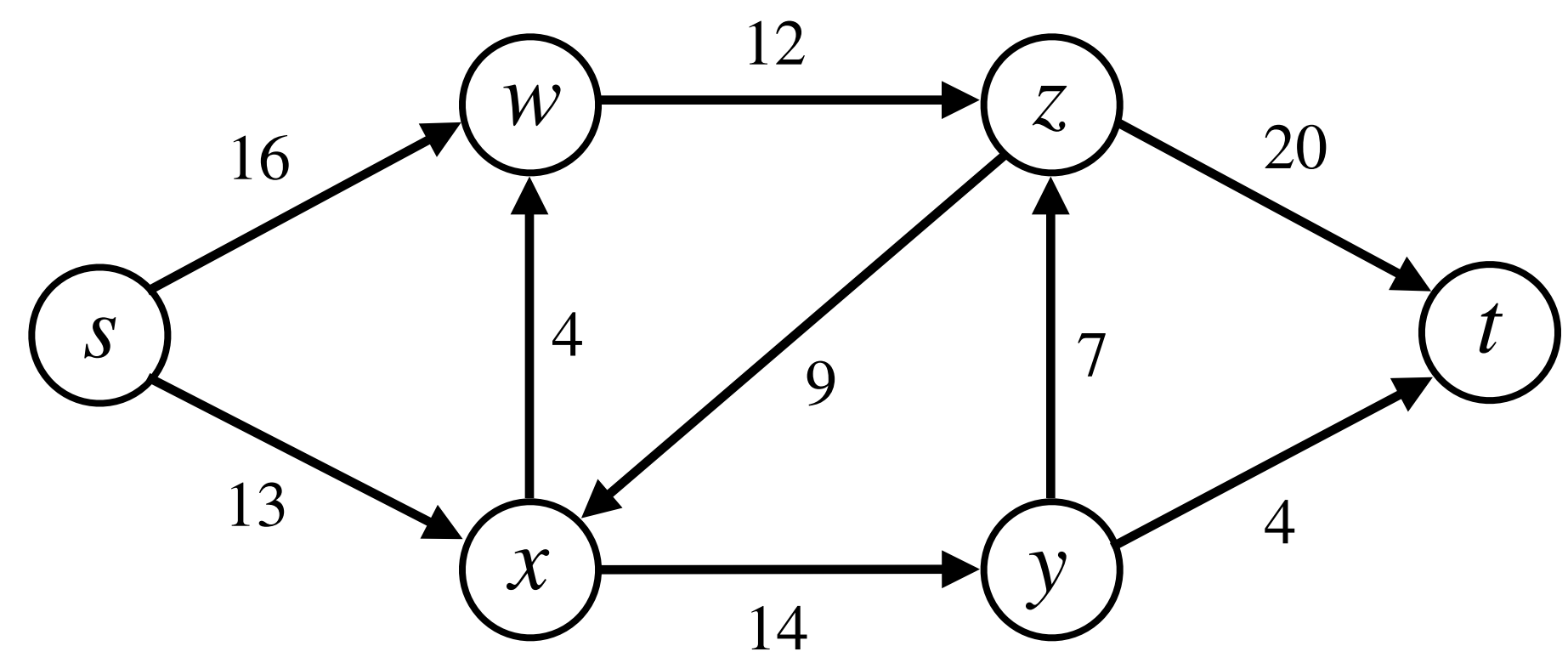
# Dijkstra's Algorithm: History

*"What is the shortest way to travel from Rotterdam to Groningen, in general: from given city to given city. It is the algorithm for the shortest path, which I **designed in about twenty minutes**. One morning I was **shopping in Amsterdam** with my young fiancée, and tired, we sat down on the **café terrace** to drink a cup of coffee and I was just thinking about whether I could do this, and I then designed the algorithm for the shortest path. As I said, it was a twenty-minute invention. In fact, it was published in '59, three years later. The publication is still readable, it is, in fact, quite nice. One of the reasons that it is so nice was that I designed it **without pencil and paper**. I learned later that one of the advantages of designing without pencil and paper is that you are almost forced to **avoid all avoidable complexities**. Eventually, that algorithm became to my great amazement, one of the cornerstones of my fame."*

— Edsger Dijkstra, in an interview with Philip L. Frana, Communications of the ACM, 2001

# Flow Networks

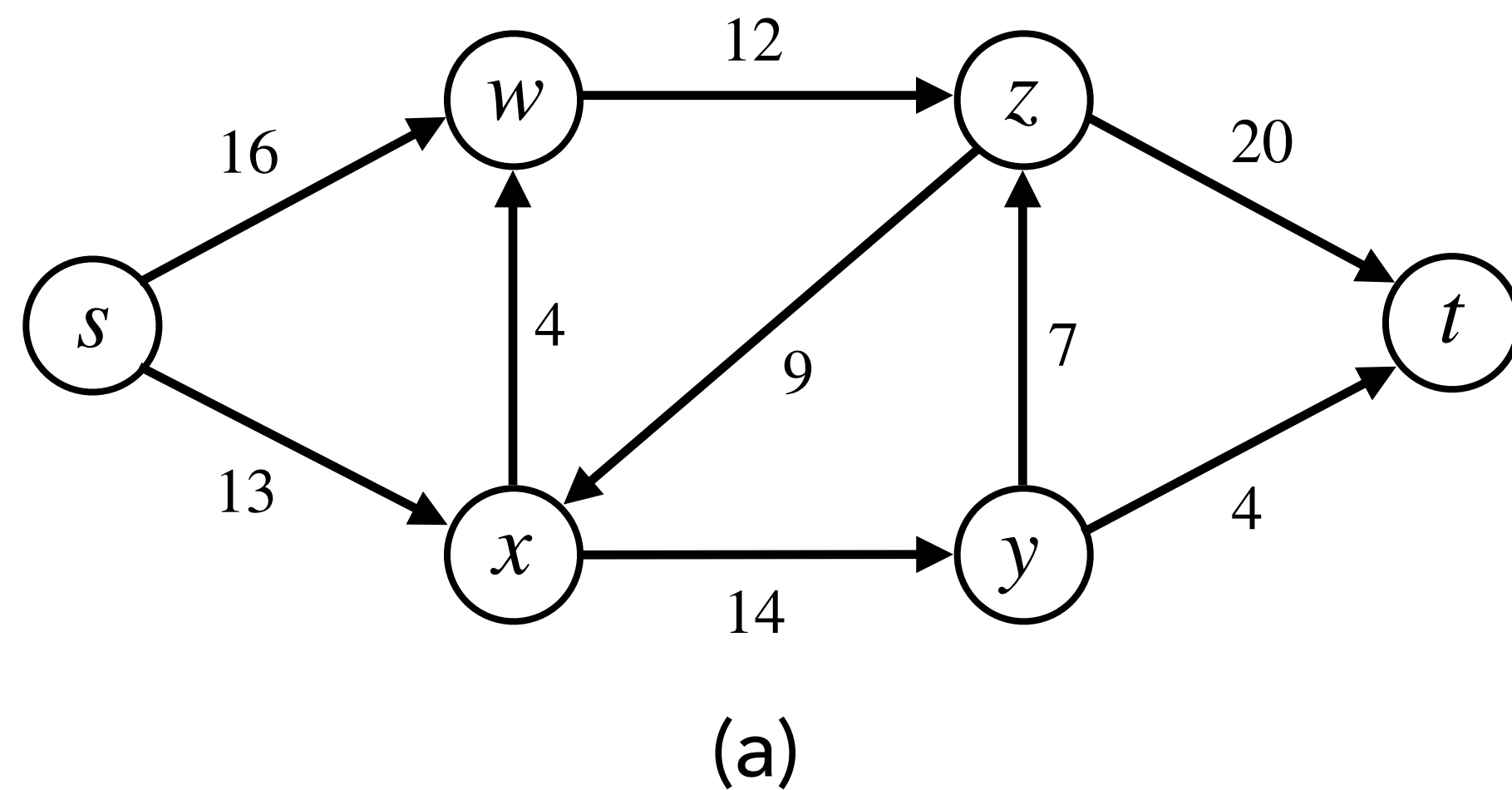
# Flow Networks



(a)

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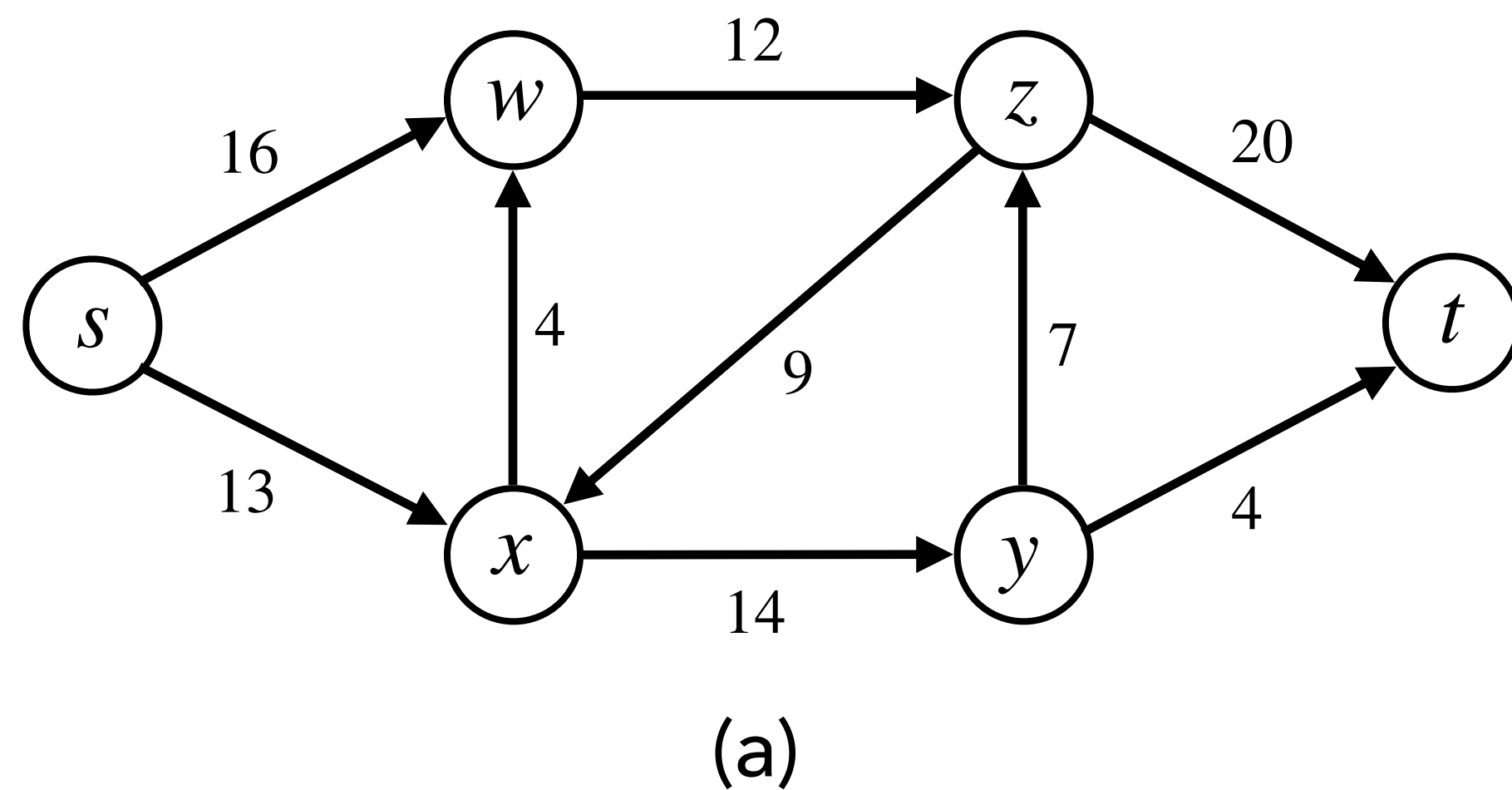
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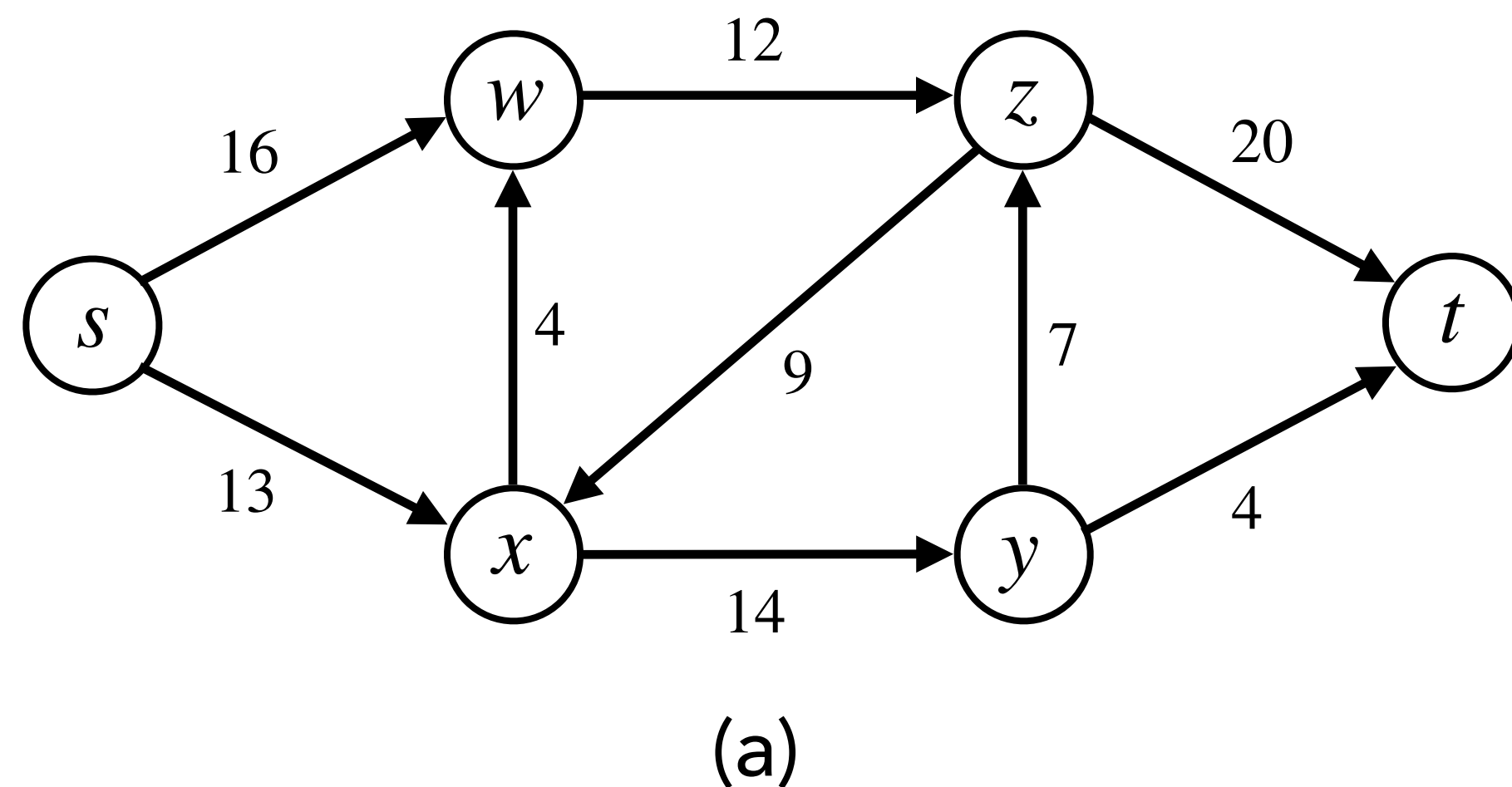
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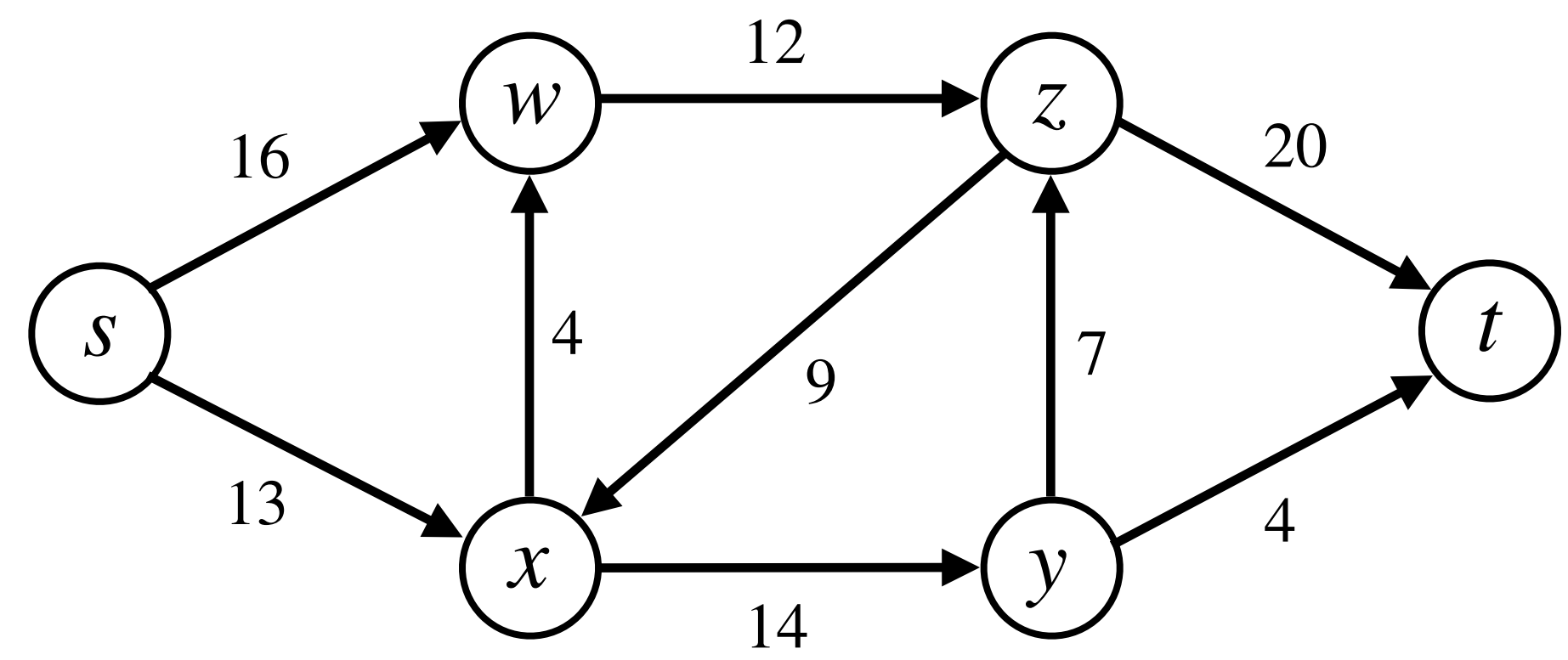
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- The number on any  $(u, v)$  edge is the **maximum number of packets** that can go from  $u$  to  $v$  per day.



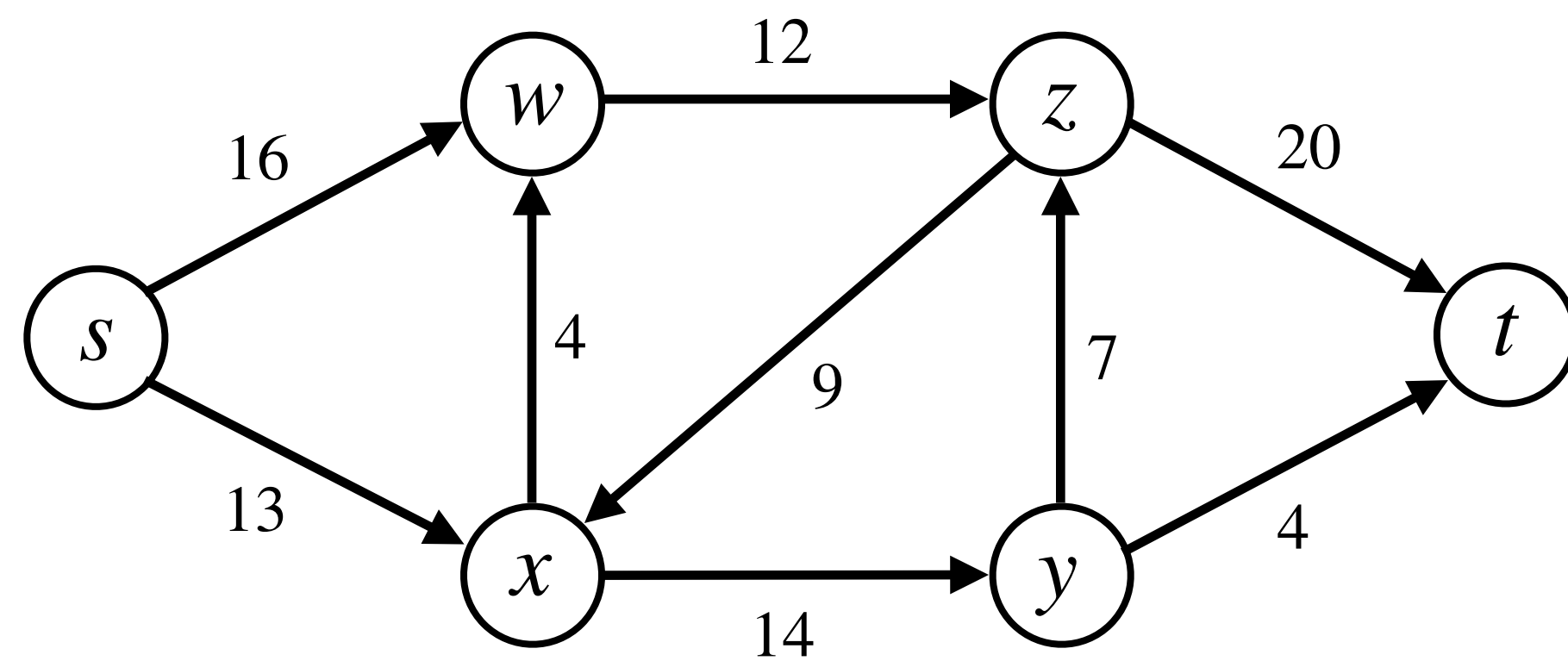
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**Goal:** Find the maximum number of packets that can be shipped from  $s$  if the packets received and

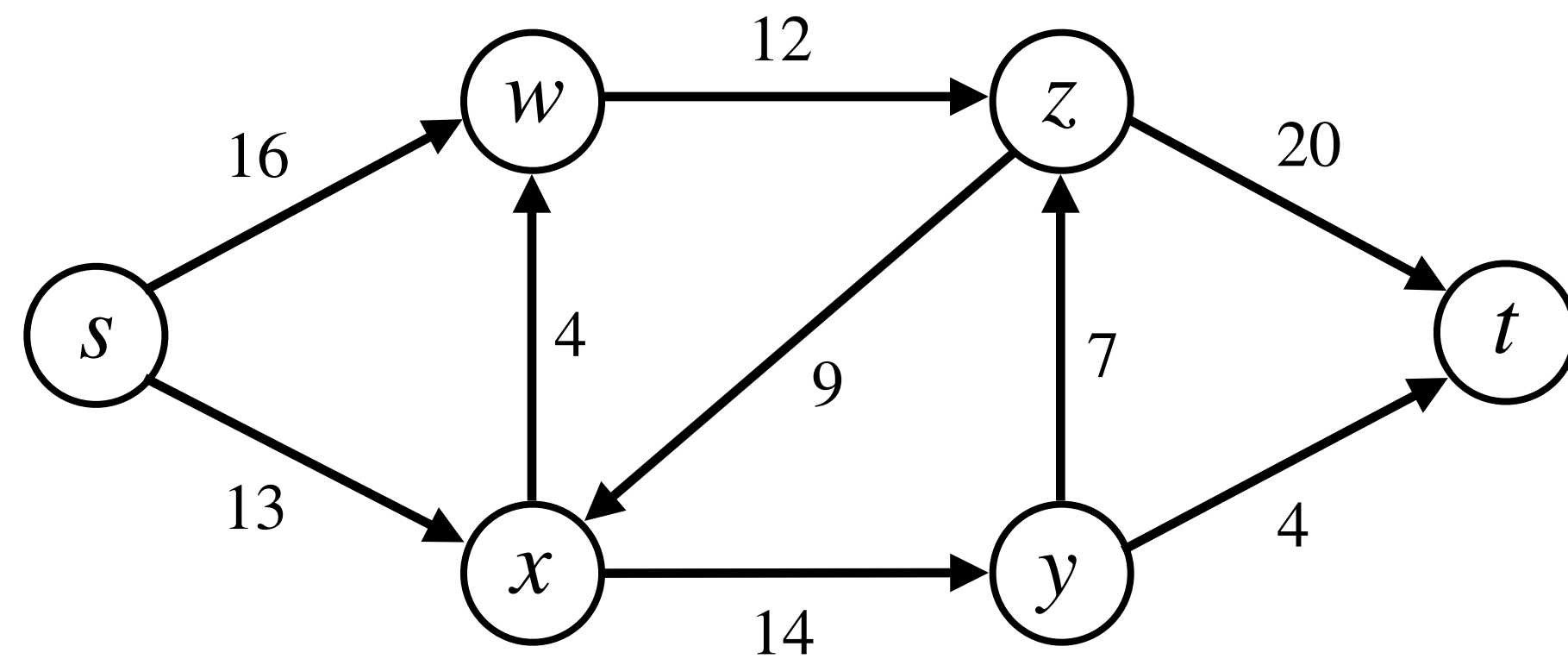


(a)



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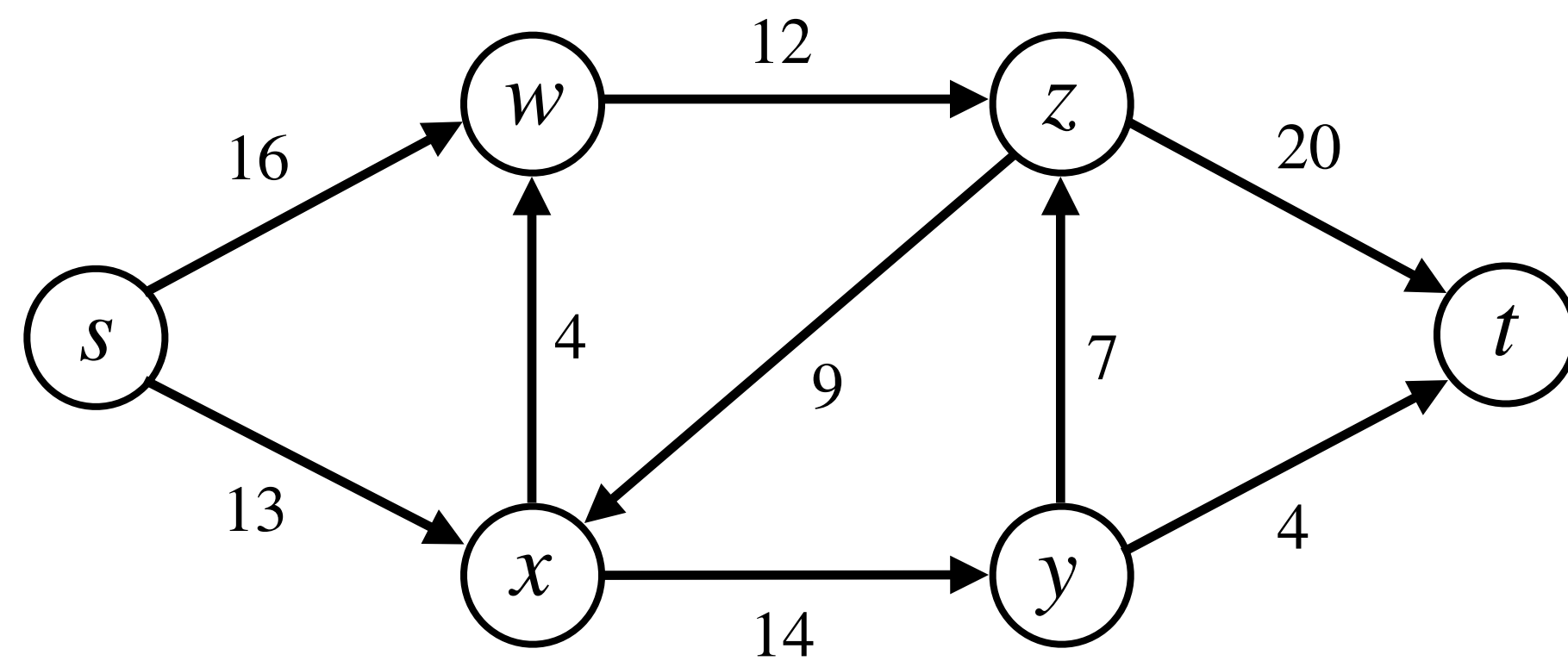
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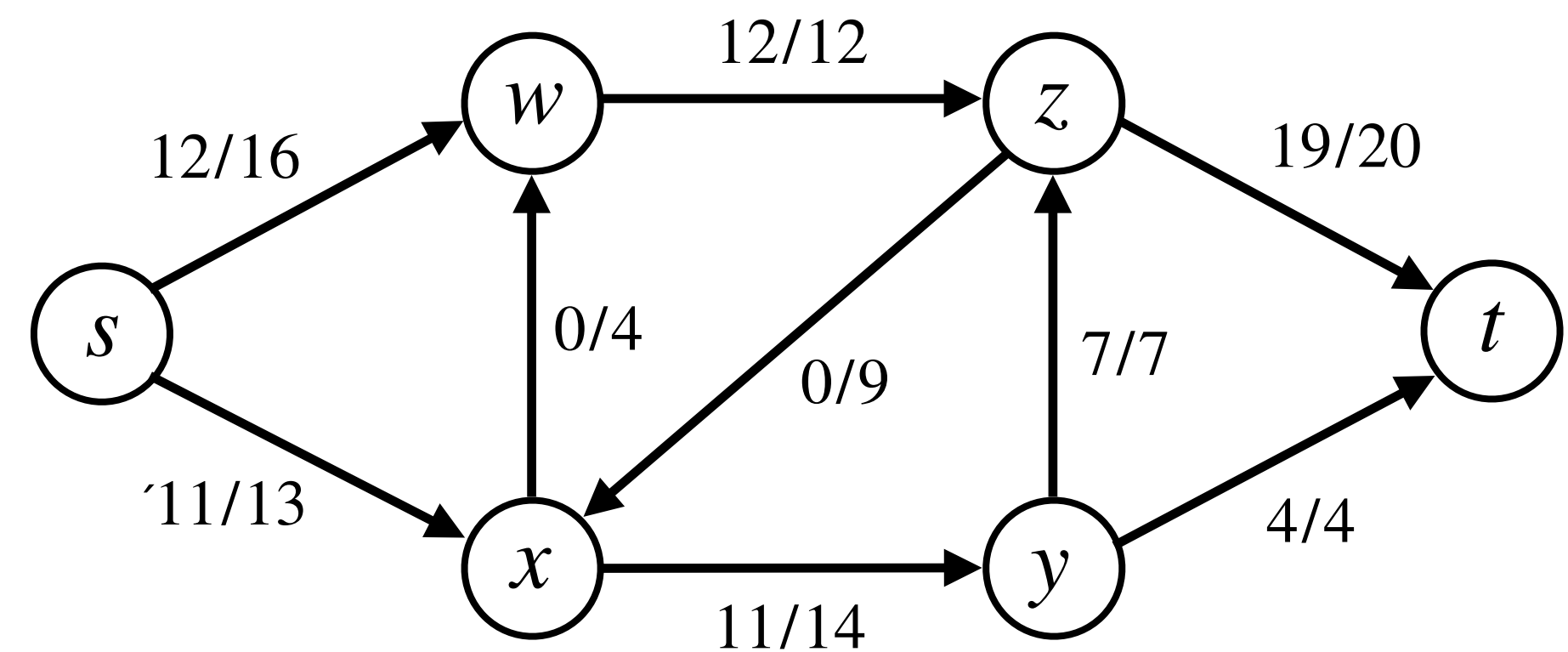
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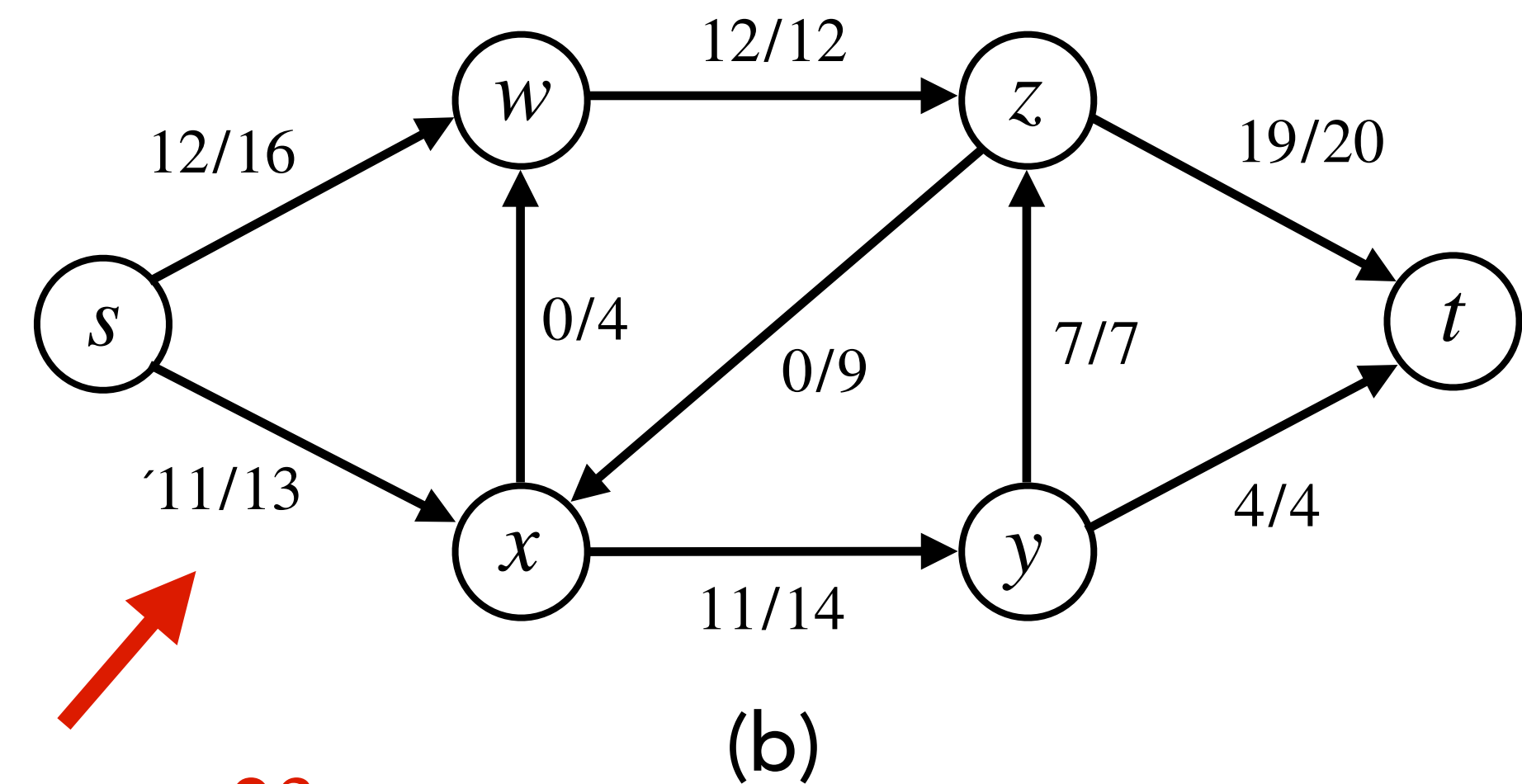
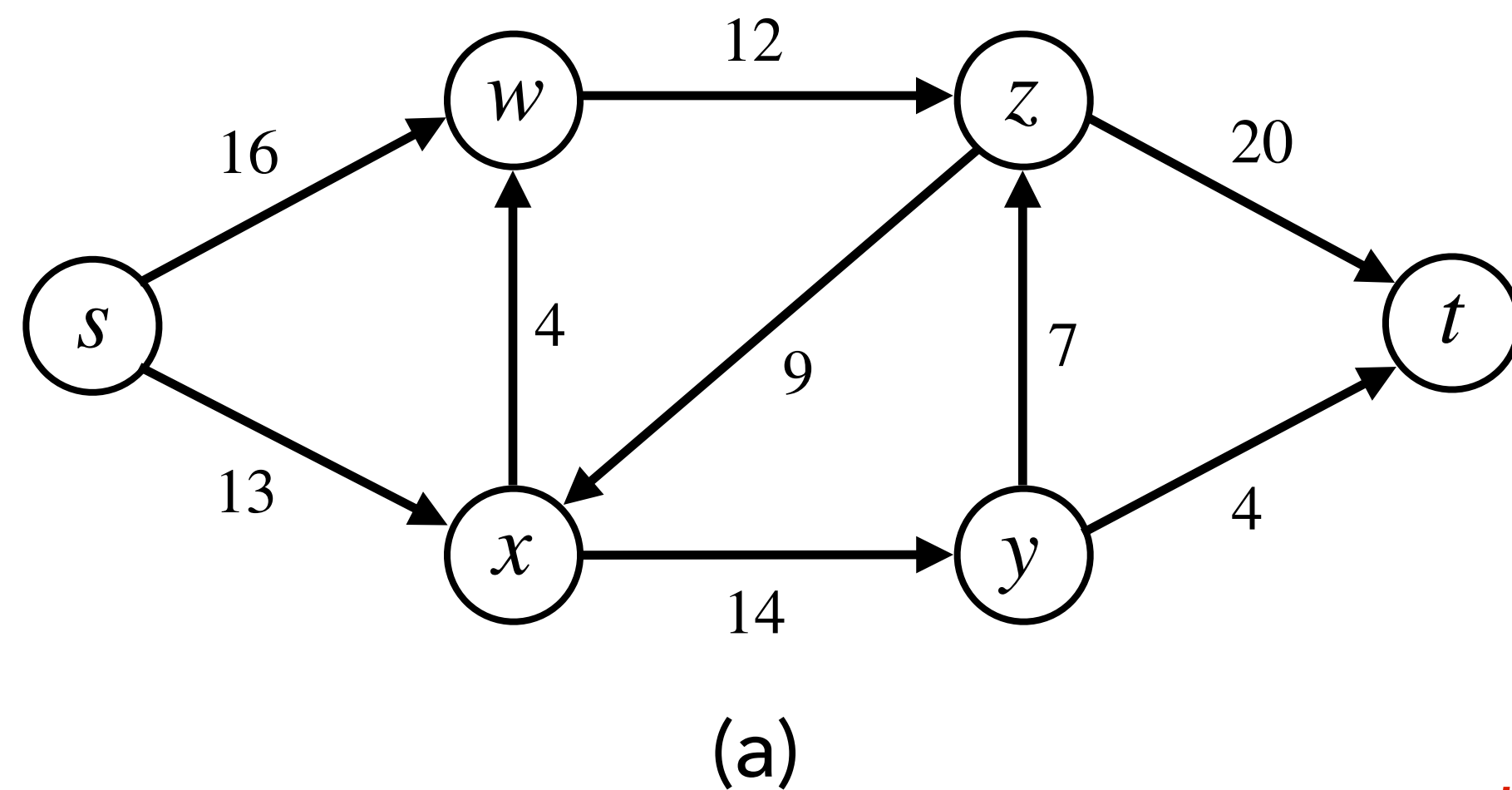
(a)



(b)

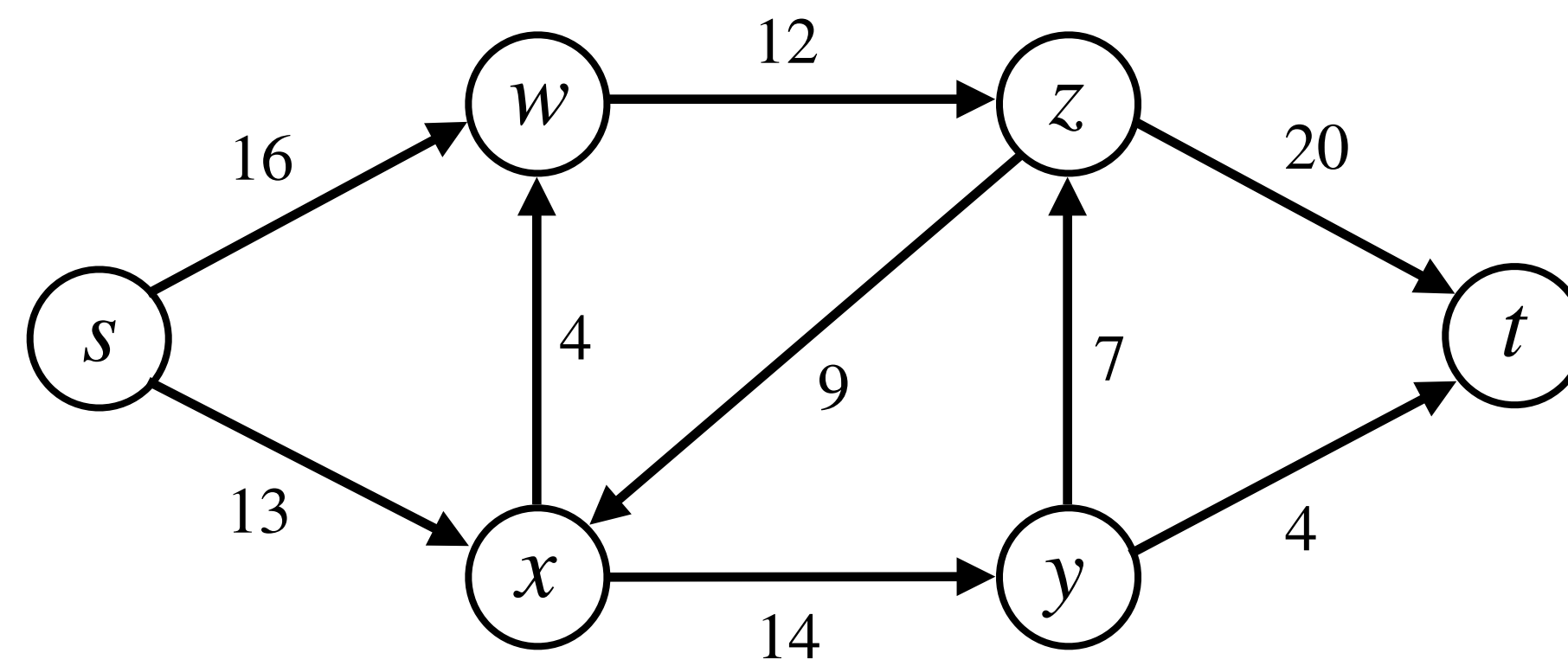
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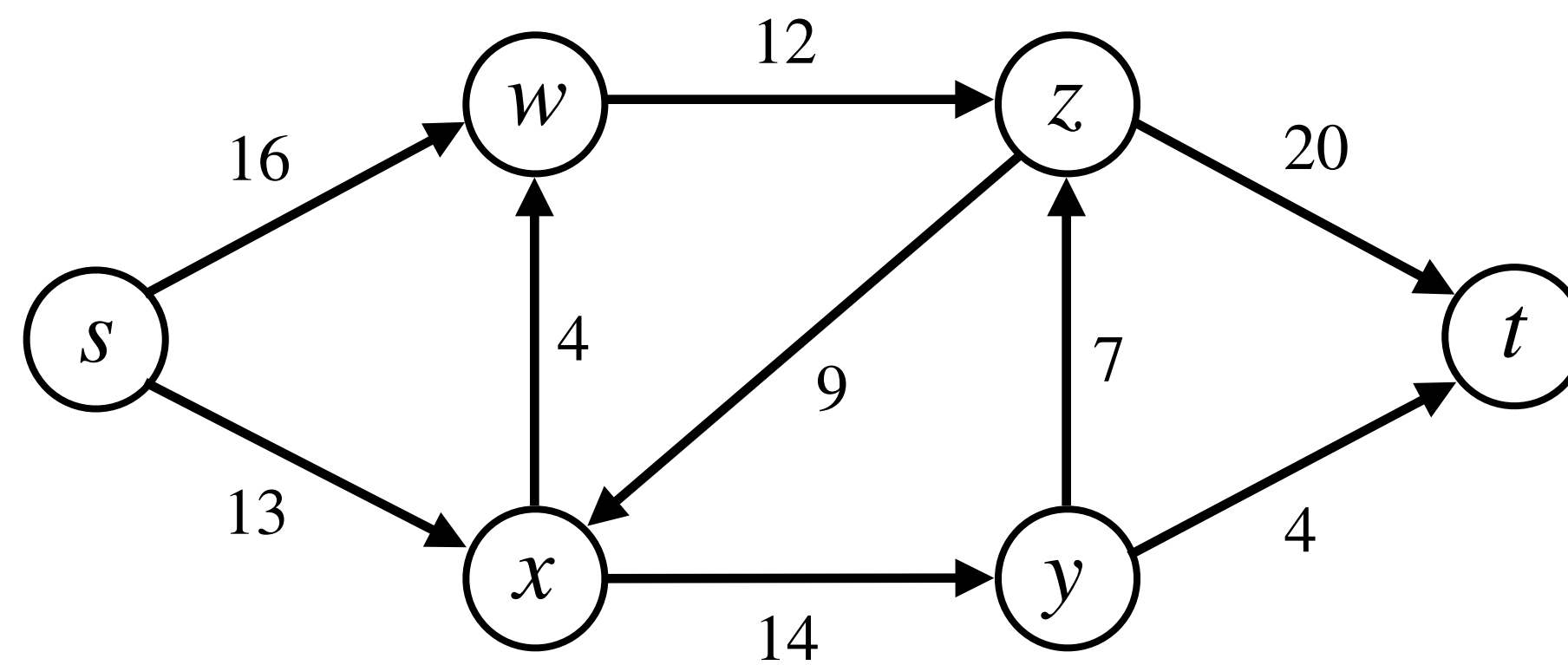
# max packets = 23

# Flow Networks



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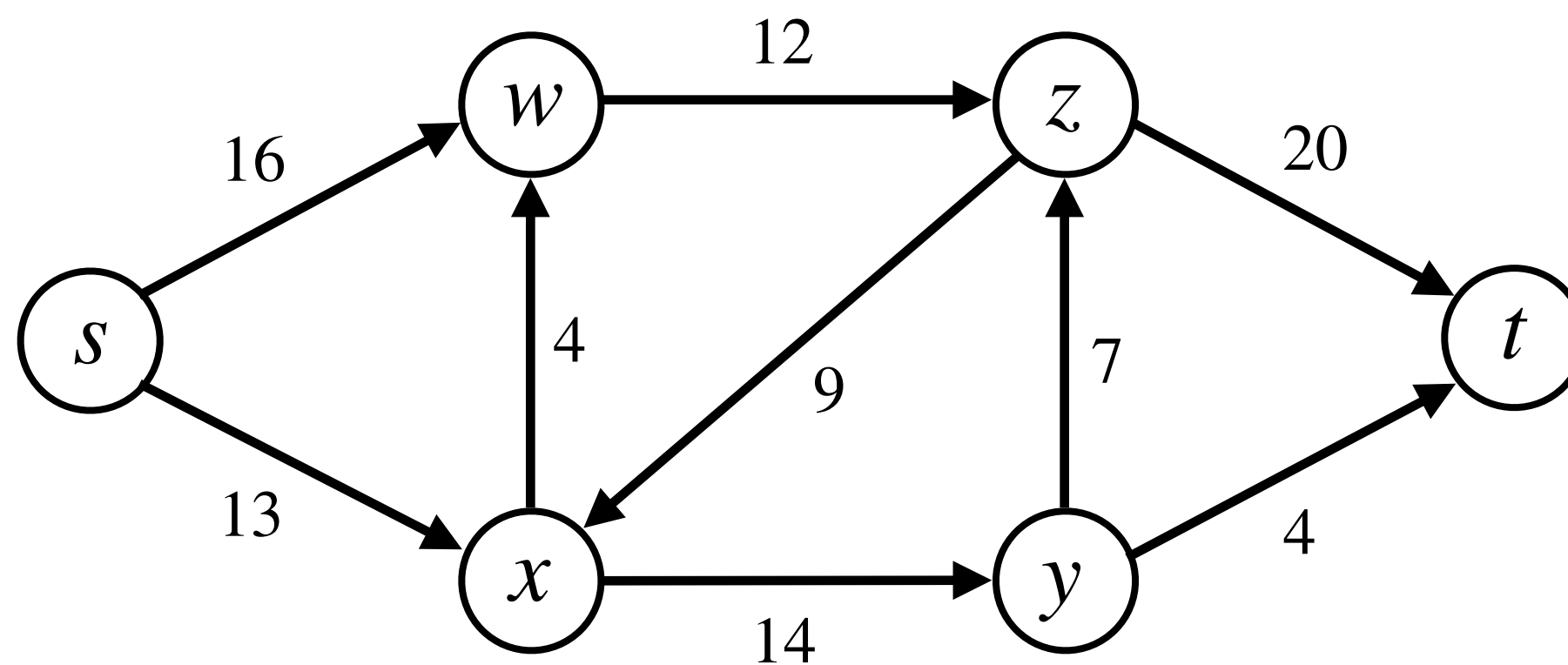
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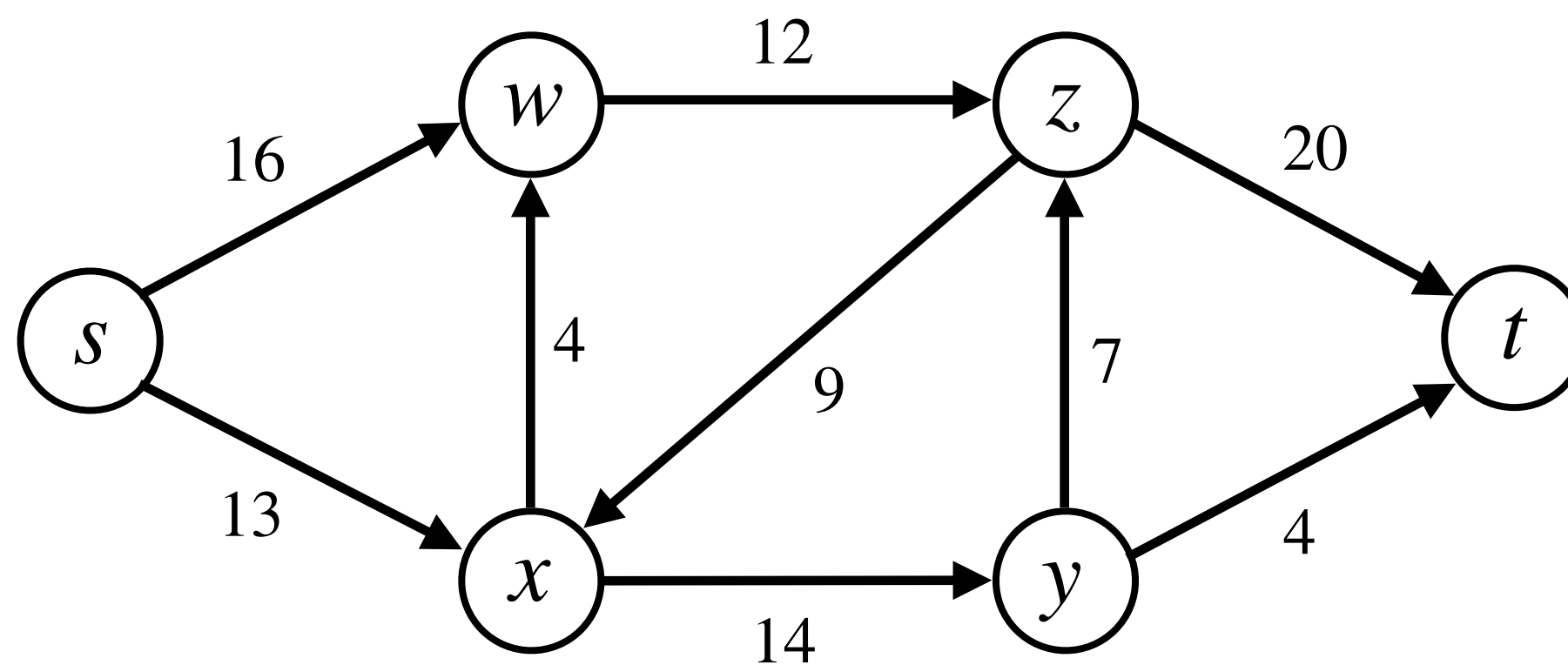
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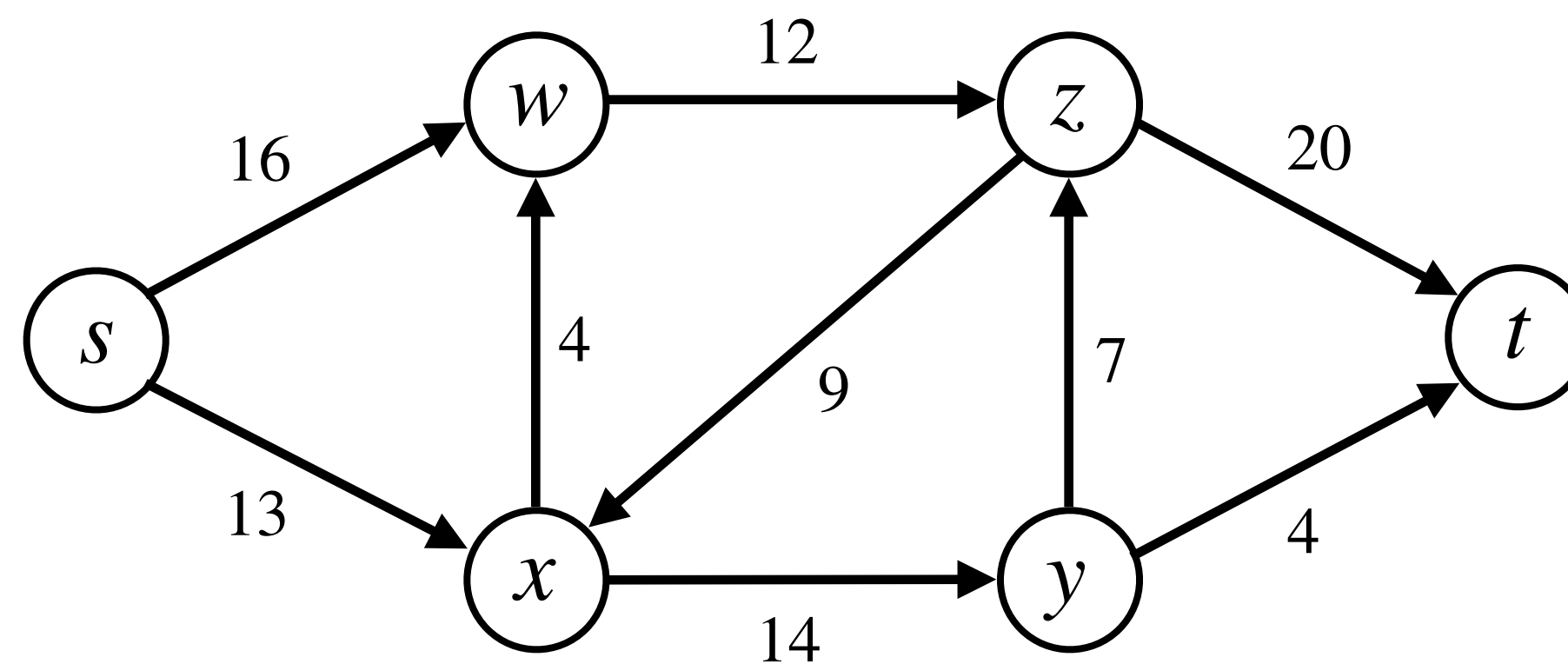
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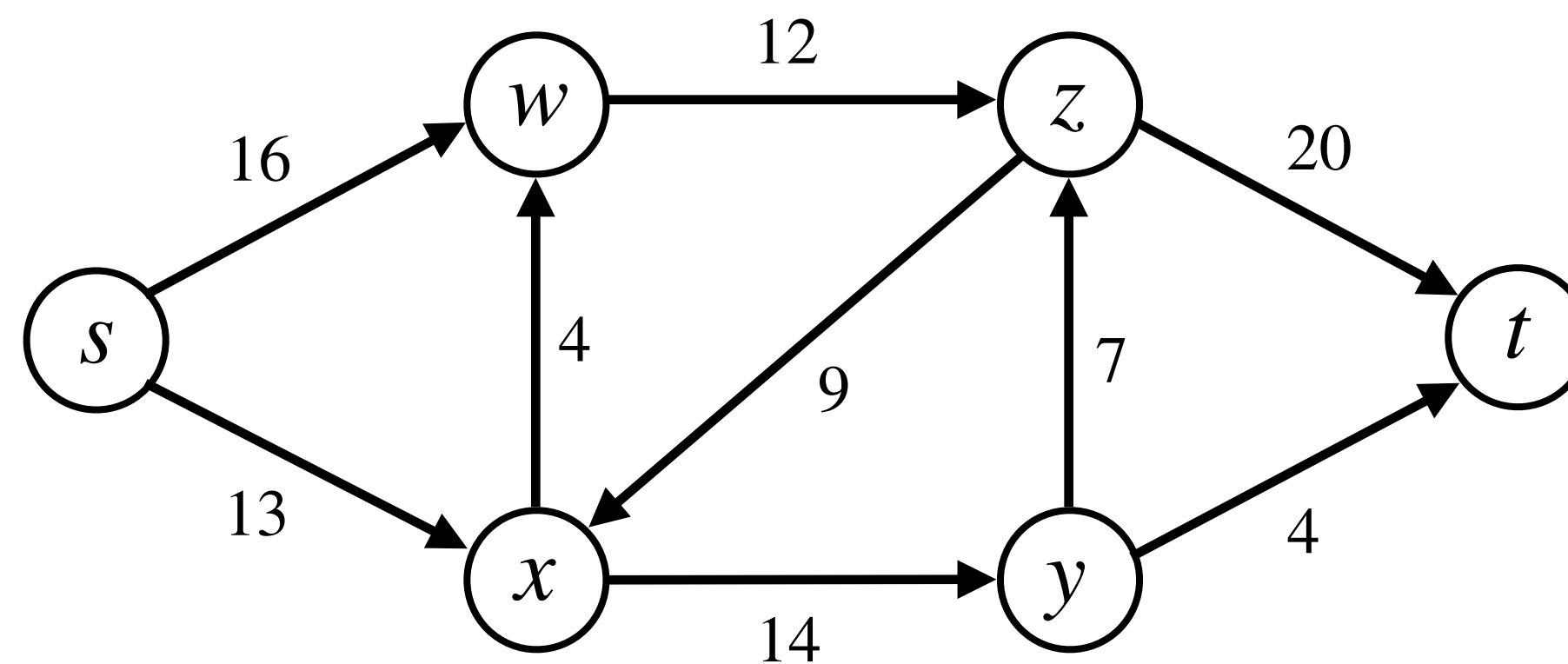




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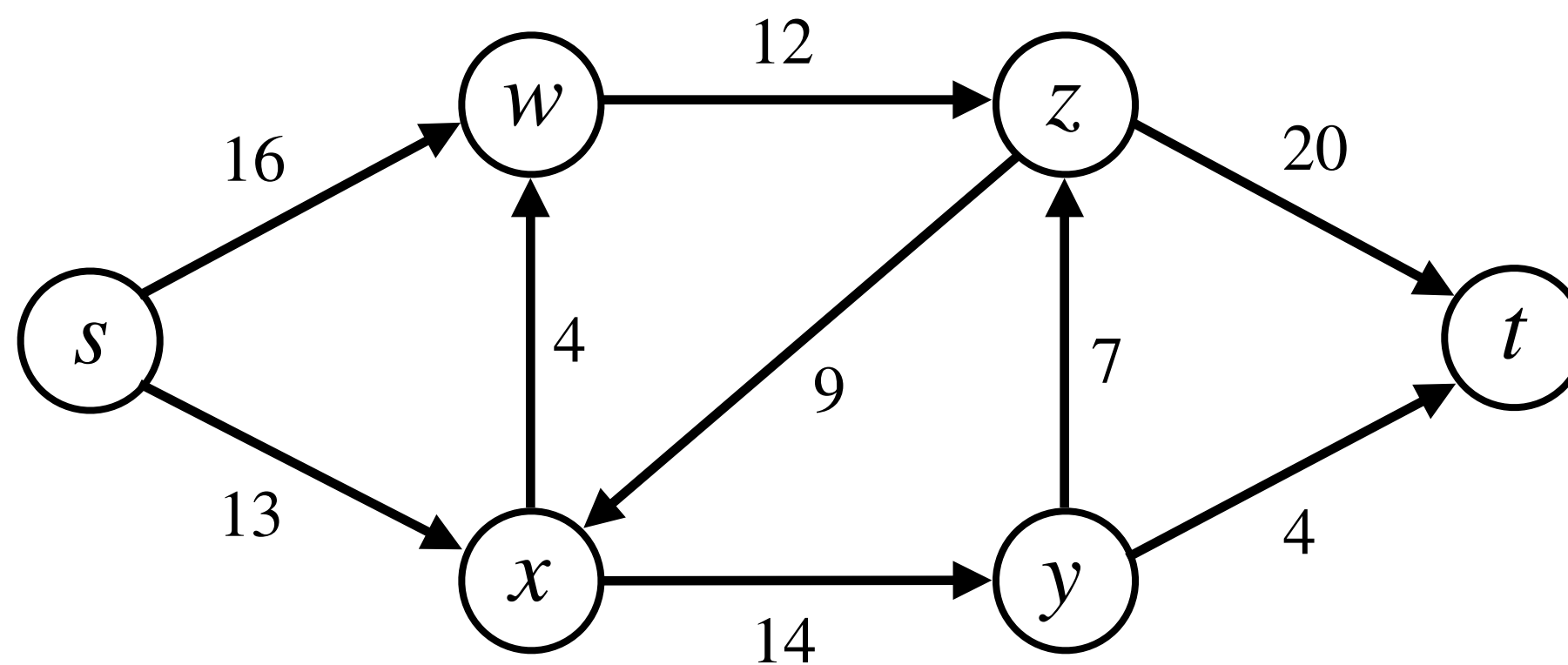
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- Two distinguished vertices: **source**  $s$  (no incoming edges) and **sink**  $t$  (no outgoing edges).
- For every  $v \in V$ , some  $s \rightsquigarrow v \rightsquigarrow t$  path exists. Hence,  $|E| \geq |V| - 1$ .

