

CS3640

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# Network Layer (4): Routing Algorithms

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# Lecture goals

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*a technical deep-dive into two classes of routing algorithms used in the Internet*

- *Link-State algorithm*
- *Distance Vector algorithm*

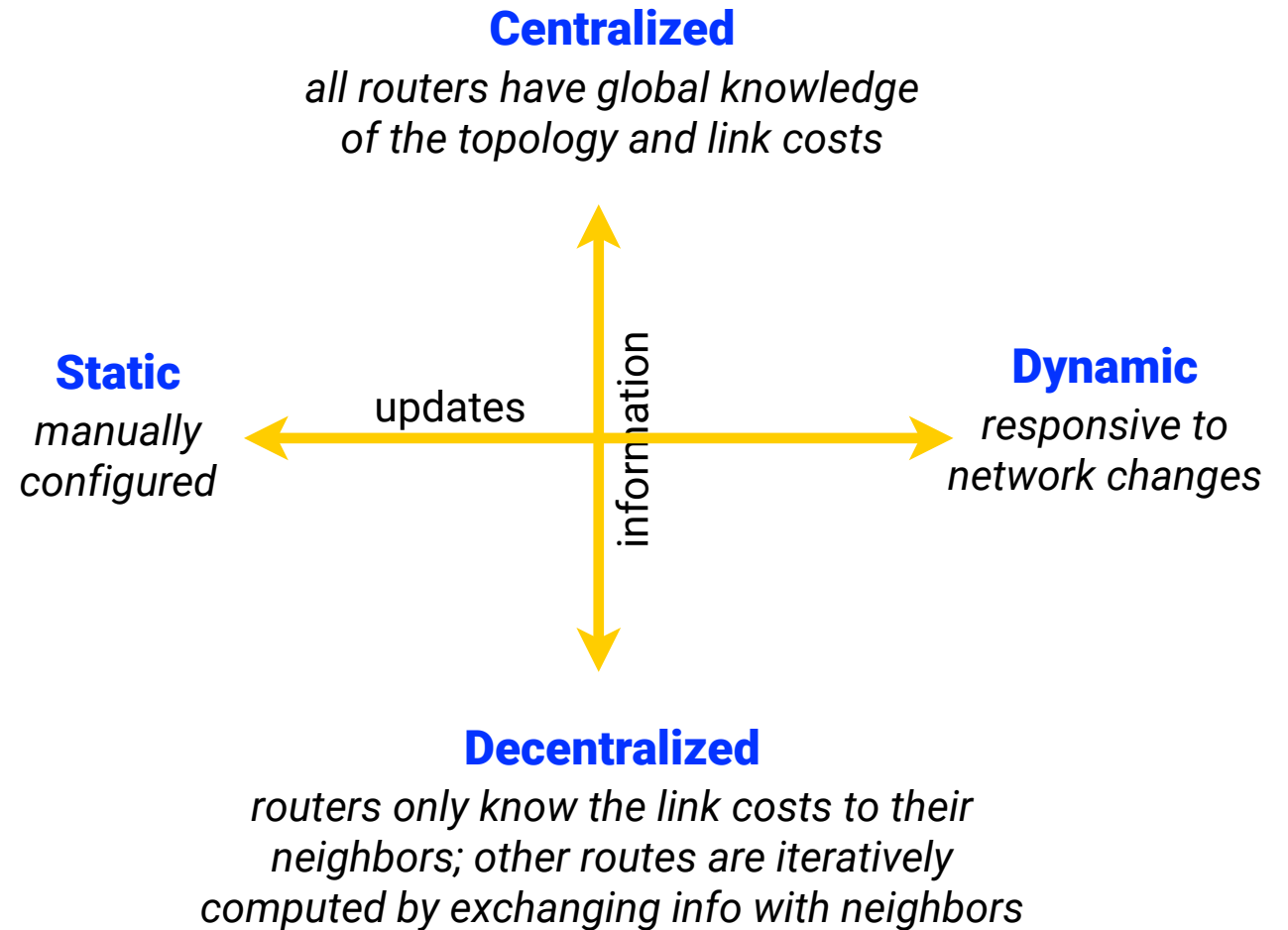


Chapters 5.1 - 5.2

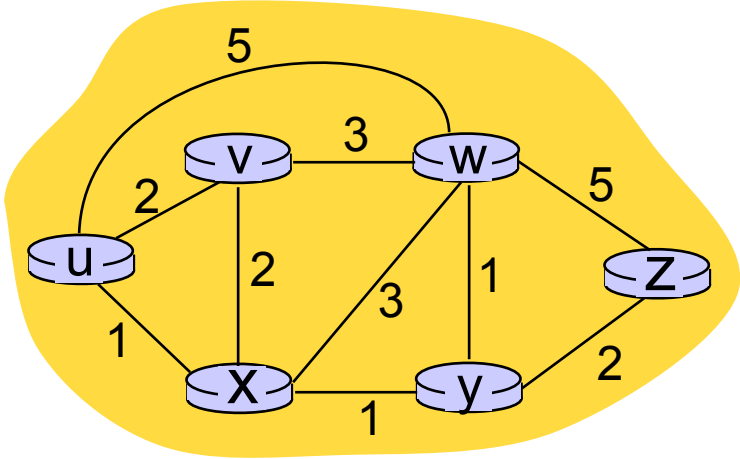
# Routing Algorithms

**Goal:** determine “good” paths from sending hosts to receiving host, through network of routers

- **path:** sequence of routers packets traverse from given initial source host to final destination host
- **good:** least “cost”, “fastest”, “least congested”, and so on!



# Representing Routing via Graph Abstraction



$C_{a,b}$ : cost of *direct* link connecting  $a$  and  $b$

e.g.,  $c_{w,z} = 5$ ,  $c_{u,z} = \infty$

*cost is defined by network operators: they could all be set to 1, or set to reflect a network metric such as bandwidth or congestion*

**Graph:  $G = (N, E)$**

$N$ : set of routers =  $\{ u, v, w, x, y, z \}$

$E$ : set of links =  $\{ (u,v), (u,x), (v,x), (v,w), (x,w), (x,y), (w,y), (w,z), (y,z) \}$

# **Dijkstra's Algorithm**

*(a link-state routing algorithm)*

# Dijkstra's Link-State Routing Algorithm

- **Centralized**: network topology, link costs known to *all* nodes (which is accomplished via a *link state broadcast* such that all nodes have same info)
- computes least cost paths from one node ("source") to all other nodes, which generates the *forwarding table* for that node
- **Iterative**: after  $k$  iterations, we know least cost path to  $k$  destinations

## notation

- $C_{a,b}$ : direct link cost from node  $a$  to  $b$ ;  $= \infty$  if not direct neighbors
- $D(a)$ : *current* estimate of cost of least-cost-path from source to destination  $a$
- $p(a)$ : predecessor node along path from source to  $a$
- $N'$ : set of nodes whose least-cost-path *definitively* known

1 Initialization:

2  $N' = \{u\}$

/\* compute least cost path from u to all other nodes \*/

3 for all nodes a

4 if a adjacent to u

/\* u initially knows direct-path-cost only to direct neighbors \*/

5 then  $D(a) = c_{u,a}$

/\* but may not be minimum cost! \*/

6 else  $D(a) = \infty$

7

8 Loop

9 find a not in  $N'$  such that  $D(a)$  is a minimum

10 add a to  $N'$

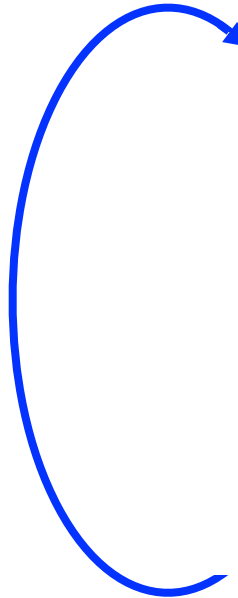
11 update  $D(b)$  for all b adjacent to a and not in  $N'$  :

12  $D(b) = \min ( D(b), D(a) + c_{a,b} )$

13 /\* new least-path-cost to b is either old least-cost-path to b or known

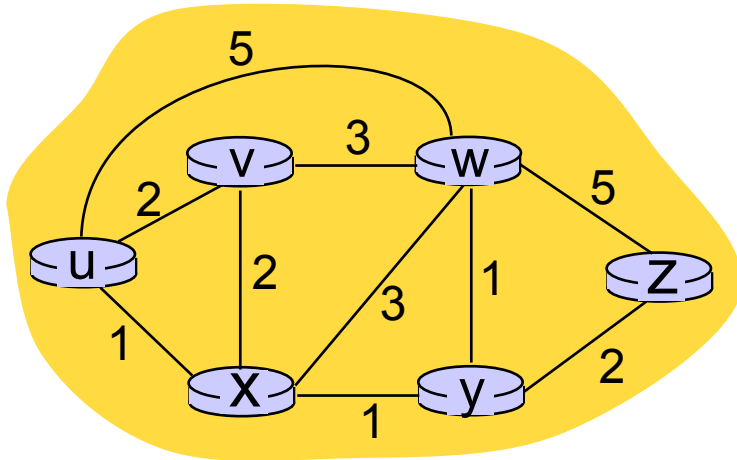
14 least-cost-path to a plus direct-cost from a to b \*/

15 until all nodes in  $N'$



# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	N'	D(v),p(v)	D(w),p(w)	D(x),p(x)	D(y),p(y)	D(z),p(z)
0	u	2,u	5,u	1,u	$\infty$	$\infty$
1						
2						
3						
4						
5						



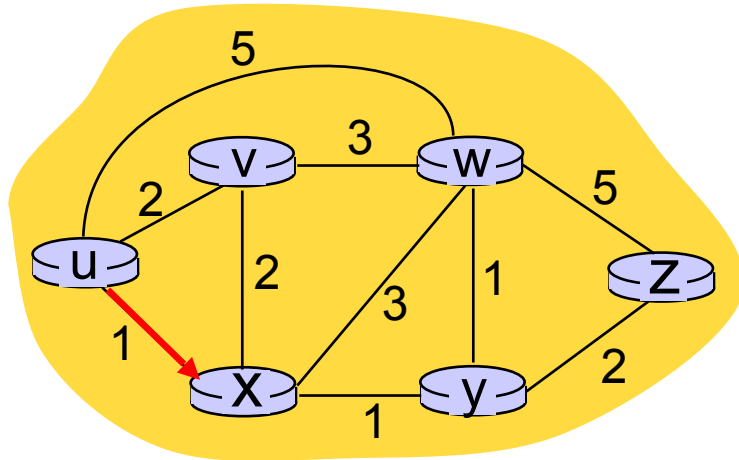
Initialization (step 0):

For all  $a$ : if  $a$  adjacent to  $u$  then  $D(a) = c_{u,a}$



# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	$N'$	$D(v), p(v)$	$D(w), p(w)$	$D(x), p(x)$	$D(y), p(y)$	$D(z), p(z)$
0	u	2, u	5, u	1, u	$\infty$	$\infty$
1	ux					
2						
3						
4						
5						



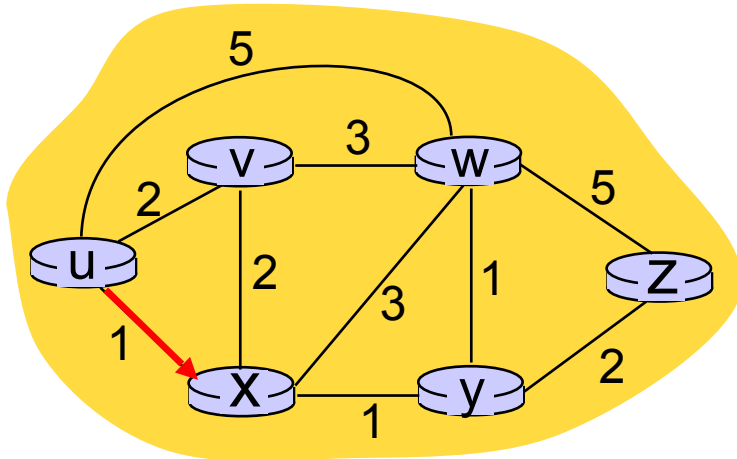
## 8 Loop

9 find  $a$  not in  $N'$  such that  $D(a)$  is a minimum

10 add  $a$  to  $N'$

# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	N'	D(v),p(v)	D(w),p(w)	D(x),p(x)	D(y),p(y)	D(z),p(z)
0	u	2,u	5,u	1,u	$\infty$	$\infty$
1	ux	2,u	4,x		2,x	$\infty$
2						
3						
4						
5						



8 Loop

9 find  $a$  not in  $N'$  such that  $D(a)$  is a minimum

10 add  $a$  to  $N'$

11 update  $D(b)$  for all  $b$  adjacent to  $a$  and not in  $N'$ :

$$D(b) = \min ( D(b), D(a) + c_{a,b} )$$

$$D(v) = \min ( D(v), D(x) + c_{x,v} ) = \min(2, 1+2) = 2$$

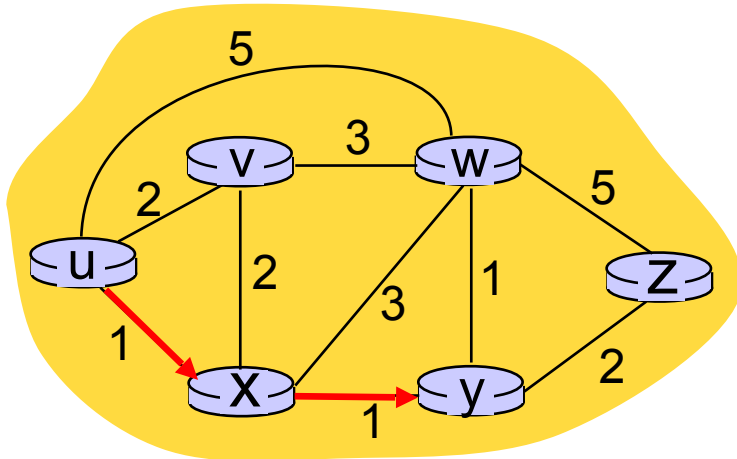
$$D(w) = \min ( D(w), D(x) + c_{x,w} ) = \min(5, 1+3) = 4$$

$$D(y) = \min ( D(y), D(x) + c_{x,y} ) = \min(\infty, 1+1) = 2$$



# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	N'	D(v),p(v)	D(w),p(w)	D(x),p(x)	D(y),p(y)	D(z),p(z)
0	u	2,u	5,u	1,u	$\infty$	$\infty$
1	ux	2,u	4,x		2,x	$\infty$
2	uxy					
3						
4						
5						



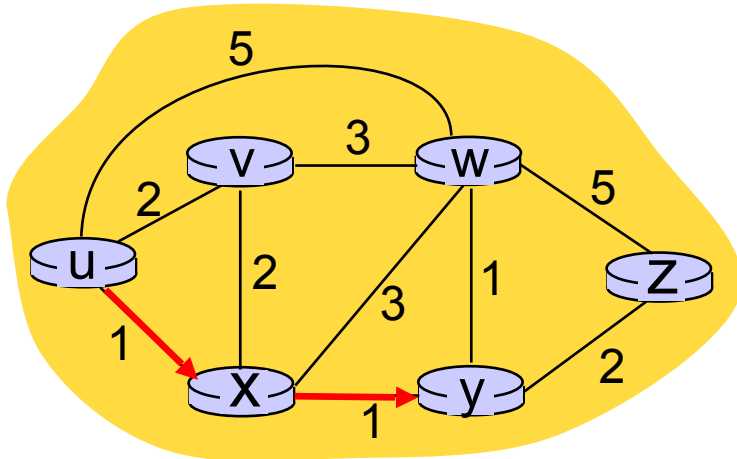
## 8 Loop

9 find  $a$  not in  $N'$  such that  $D(a)$  is a minimum

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# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	N'	D(v),p(v)	D(w),p(w)	D(x),p(x)	D(y),p(y)	D(z),p(z)
0	u	2,u	5,u	1,u	$\infty$	$\infty$
1	ux	2,u	4,x		2,x	$\infty$
2	uxy	2,u	3,y			4,y
3						
4						
5						



8 Loop

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10 add  $a$  to  $N'$

11 update  $D(b)$  for all  $b$  adjacent to  $a$  and not in  $N'$ :

$$D(b) = \min ( D(b), D(a) + c_{a,b} )$$

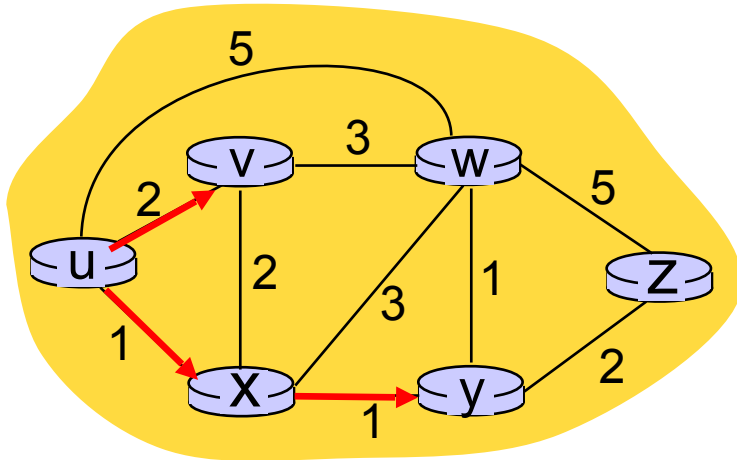
$$D(w) = \min ( D(w), D(y) + c_{x,w} ) = \min ( 4, 2+1 ) = 3$$

$$D(z) = \min ( D(z), D(y) + c_{y,z} ) = \min ( \infty, 2+2 ) = 4$$



# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	$N'$	$D(v), p(v)$	$D(w), p(w)$	$D(x), p(x)$	$D(y), p(y)$	$D(z), p(z)$
0	u	2, u	5, u	1, u	$\infty$	$\infty$
1	ux	2, u	4, x	2, x	$\infty$	$\infty$
2	uxy	2, u	3, y		4, y	
3	uxyv					
4						
5						



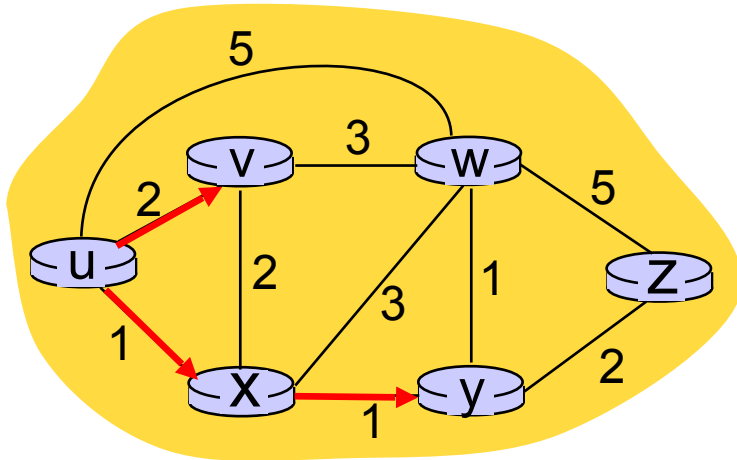
## 8 Loop

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10 add  $a$  to  $N'$

# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	N'	D(v),p(v)	D(w),p(w)	D(x),p(x)	D(y),p(y)	D(z),p(z)
0	u	2,u	5,u	1,u	$\infty$	$\infty$
1	ux	2,u	4,x	2,x	$\infty$	$\infty$
2	uxy	2,u	3,y			4,y
3	uxyv		3,y			4,y
4						
5						



## 8 Loop

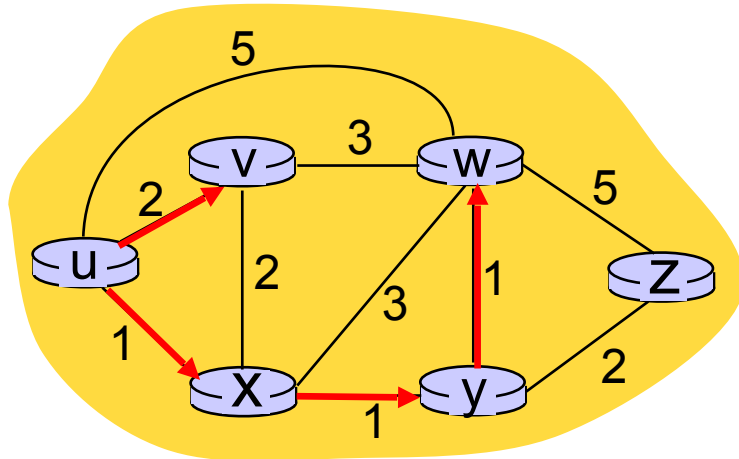
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$$D(b) = \min ( D(b), D(a) + c_{a,b} )$$

$$D(w) = \min ( D(w), D(v) + c_{v,w} ) = \min ( 3, 2+3 ) = 3$$

# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	$N'$	$D(v), p(v)$	$D(w), p(w)$	$D(x), p(x)$	$D(y), p(y)$	$D(z), p(z)$
0	u	2, u	5, u	1, u	$\infty$	$\infty$
1	ux	2, u	4, x	2, x	$\infty$	$\infty$
2	uxy	2, u	3, y		4, y	
3	uxyv		3, y		4, y	
4	uxyvw					
5						



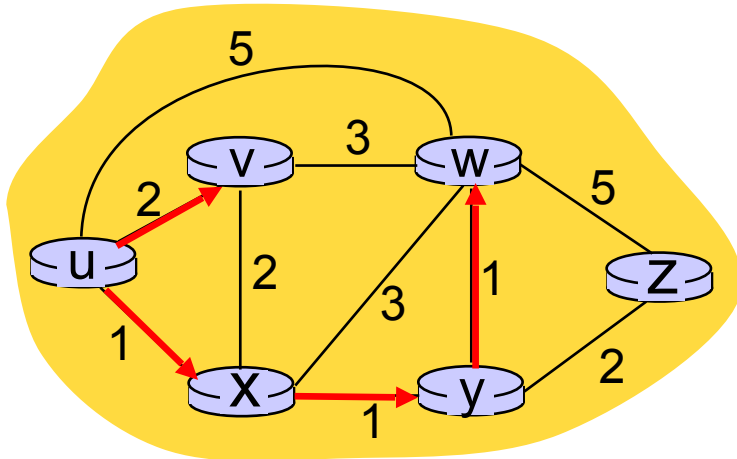
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# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
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0	u	2,u	5,u	1,u	$\infty$	$\infty$
1	ux	2,u	4,x		2,x	$\infty$
2	uxy	2,u	3,y			4,y
3	uxyv		3,y			4,y
4	uxyvw					4,y
5						



## 8 Loop

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- 10 add  $a$  to  $N'$
- 11 update  $D(b)$  for all  $b$  adjacent to  $a$  and not in  $N'$ :

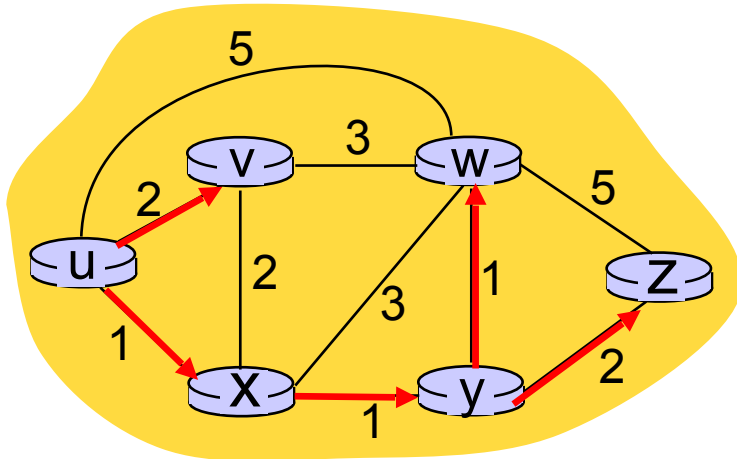
$$D(b) = \min ( D(b), D(a) + c_{a,b} )$$

$$D(z) = \min ( D(z), D(w) + c_{w,z} ) = \min ( 4, 3+5 ) = 4$$



# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	N'	D(v),p(v)	D(w),p(w)	D(x),p(x)	D(y),p(y)	D(z),p(z)
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2	uxy	2,u	3,y			4,y
3	uxyv		3,y			4,y
4	uxyvw					4,y
5	uxyvwz					



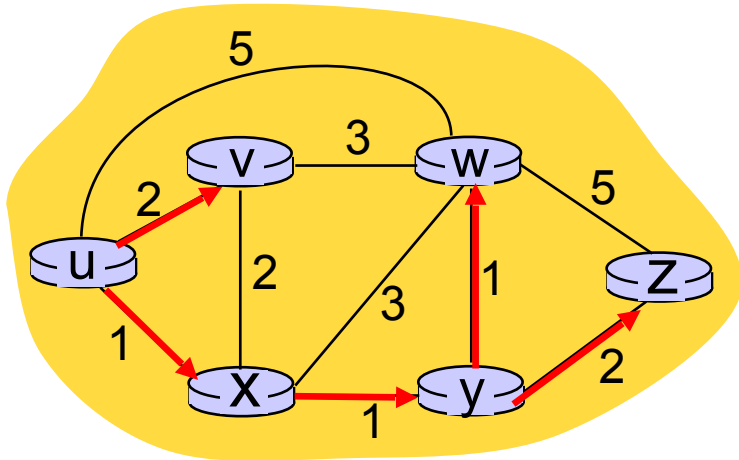
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# Dijkstra's algorithm: an example

		<b>v</b>	<b>w</b>	<b>x</b>	<b>y</b>	<b>z</b>
Step	N'	D(v),p(v)	D(w),p(w)	D(x),p(x)	D(y),p(y)	D(z),p(z)
0	u	2,u	5,u	1,u	$\infty$	$\infty$
1	ux	2,u	4,x		2,x	$\infty$
2	uxy	2,u	3,y			4,y
3	uxyv		3,y			4,y
4	uxyvw					4,y
5	uxyvwz					

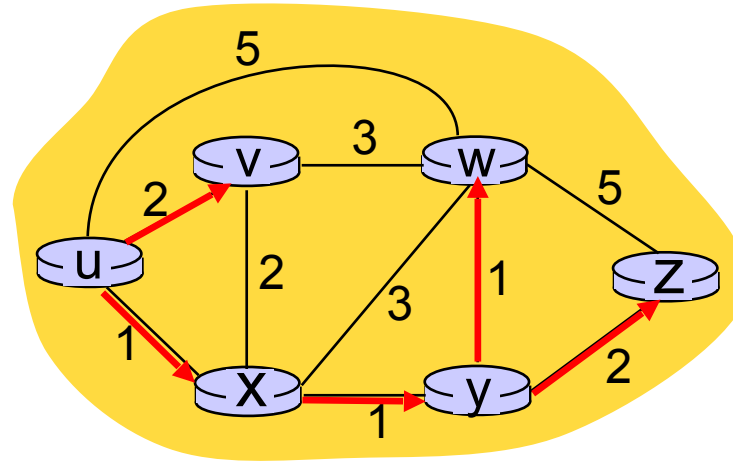


## 8 Loop

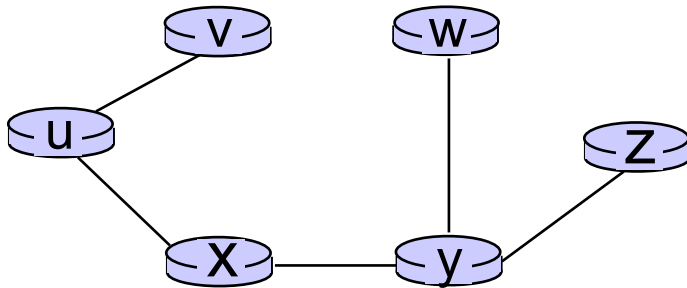
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- 10 add  $a$  to  $N'$
- 11 update  $D(b)$  for all  $b$  adjacent to  $a$  and not in  $N'$  :  

$$D(b) = \min ( D(b), D(a) + c_{a,b} )$$

# Dijkstra's algorithm: an example



resulting least-cost-path tree from u:



resulting forwarding table in u:

destination	outgoing link
v	(u,v)
x	(u,x)
y	(u,x)
w	(u,x)
z	(u,x)

route from  $u$  to  $v$  directly

route from  $u$  to all other destinations via  $x$

# Comparing Dijkstra and Bellman-Ford Algorithms

	Dijkstra (LS)	Bellman-Ford (DV)
Algorithm structure	Centralized	
Speed of convergence	$O(N^2)$	
Application	Routing within autonomous systems	
Robustness	Route oscillations	

# **Bellman-Ford Algorithm**

*(a distance-vector routing algorithm)*

## Bellman-Ford equation

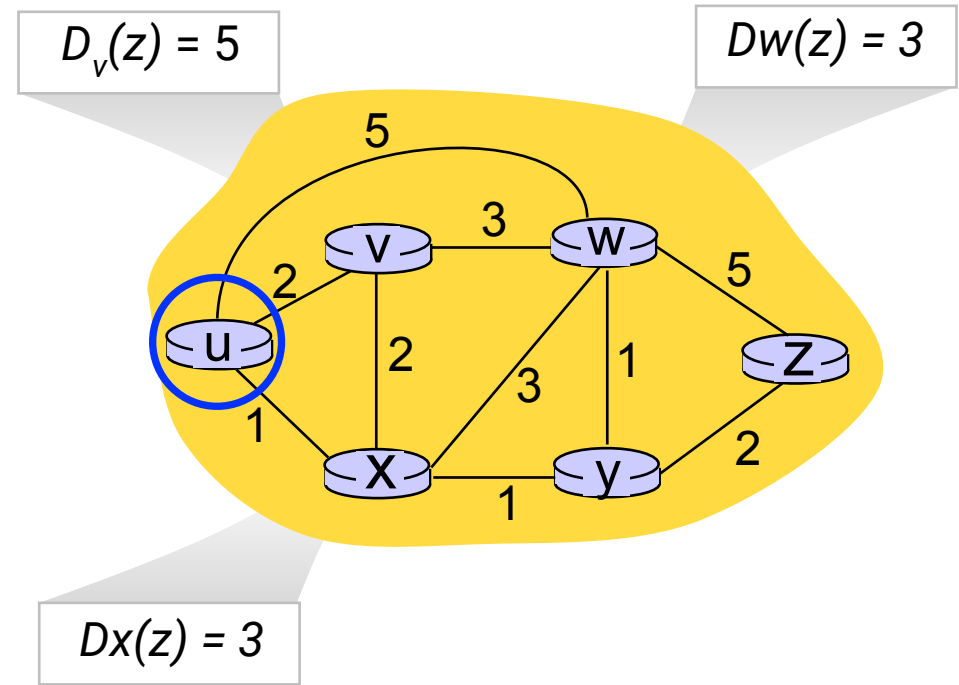
Let  $D_x(y)$ : cost of least-cost path from  $x$  to  $y$ .

$$\text{Then, } D_x(y) = \min_v \{c_{x,v} + D_v(y)\}$$

$\min$  taken over all  
neighbors  $v$  of  $x$

$v$ 's estimated  
least-cost-path  
cost to  $y$

direct cost of link  
from  $x$  to  $v$



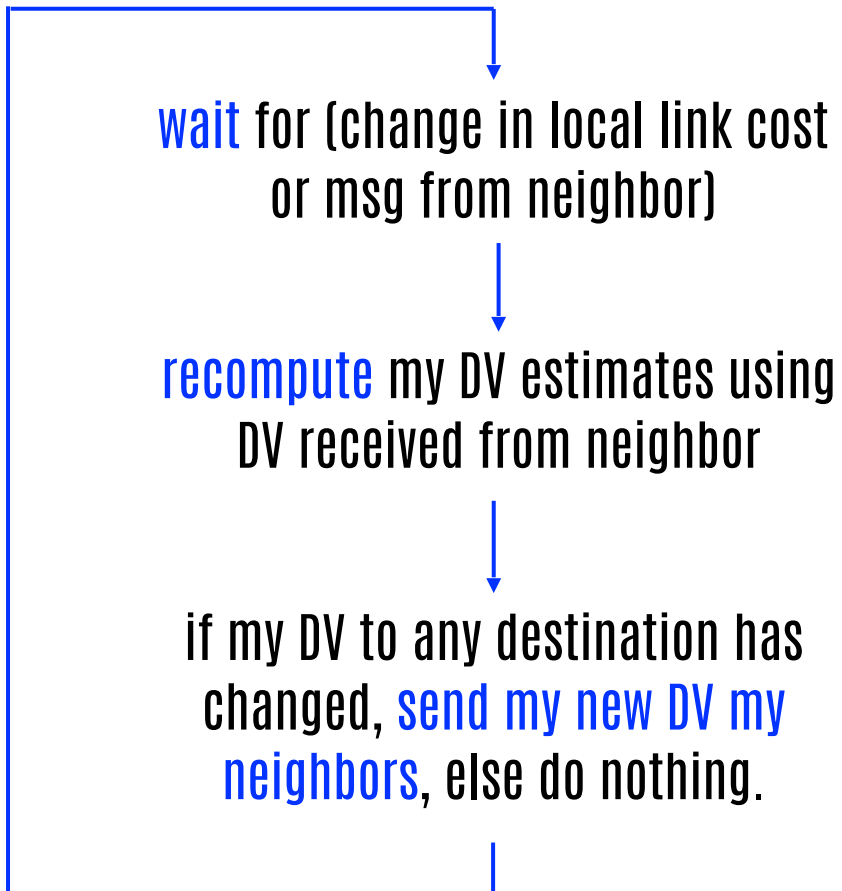
Suppose that  $u$ 's neighboring nodes ( $x, v$ , and  $w$ ) know their cost for destination  $z$ :

Bellman-Ford equation says:

$$D_u(z) = \min \{ c_{u,v} + D_v(z), \quad c_{u,x} + D_x(z), \quad c_{u,w} + D_w(z) \} = \min \{ 2 + 5, \quad 1 + 3, \quad 5 + 3 \} = 4$$

# Bellman-Ford Distance Vector Algorithm

Each node:



## Key Characteristics

- **Distributed/Decentralized**: routers do not need global knowledge of network topology
- **Iterative**: routes are computed iteratively in response to link cost change or DV updates from neighbors
- **Asynchronous**: routers do not need to synchronize on their route computations, or DV announcements
- **Self-stopping**: neighbors communicate only if necessary, and stop when no notifications are received

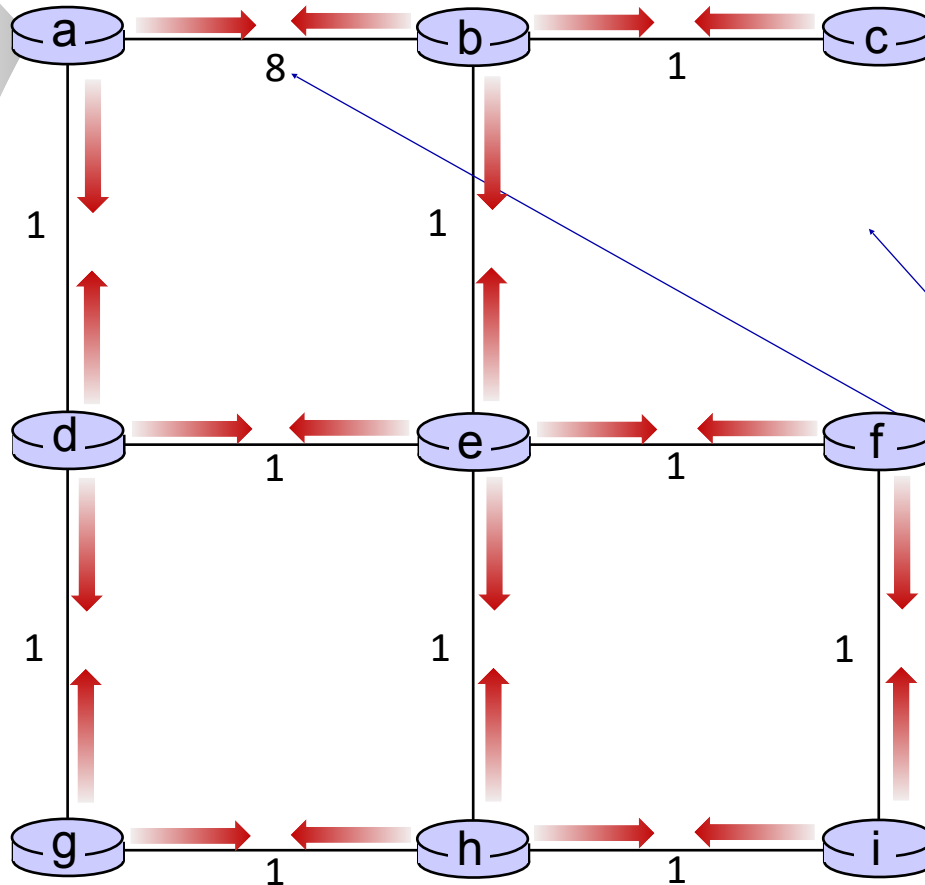
# Bellman-Ford Algorithm: an example



t=0

- All nodes have distance estimates to nearest neighbors (only)
- All nodes send their local distance vector to their neighbors

DV in a:
$D_a(a)=0$
$D_a(b)=8$
$D_a(c)=\infty$
$D_a(d)=1$
$D_a(e)=\infty$
$D_a(f)=\infty$
$D_a(g)=\infty$
$D_a(h)=\infty$
$D_a(i)=\infty$



A few asymmetries:

- missing link
- larger cost



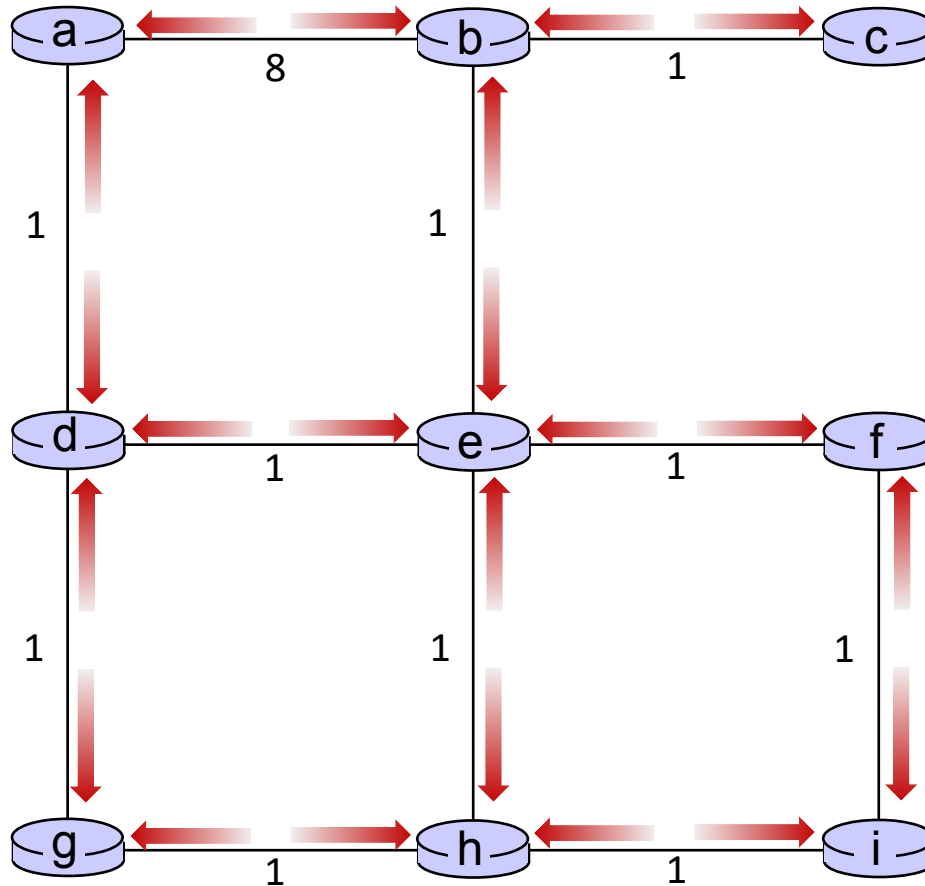
# Bellman-Ford Algorithm: how iterations work



t=1

All nodes:

- receive distance vectors from neighbors
- compute their new local distance vector
- send their new local distance vector to neighbors



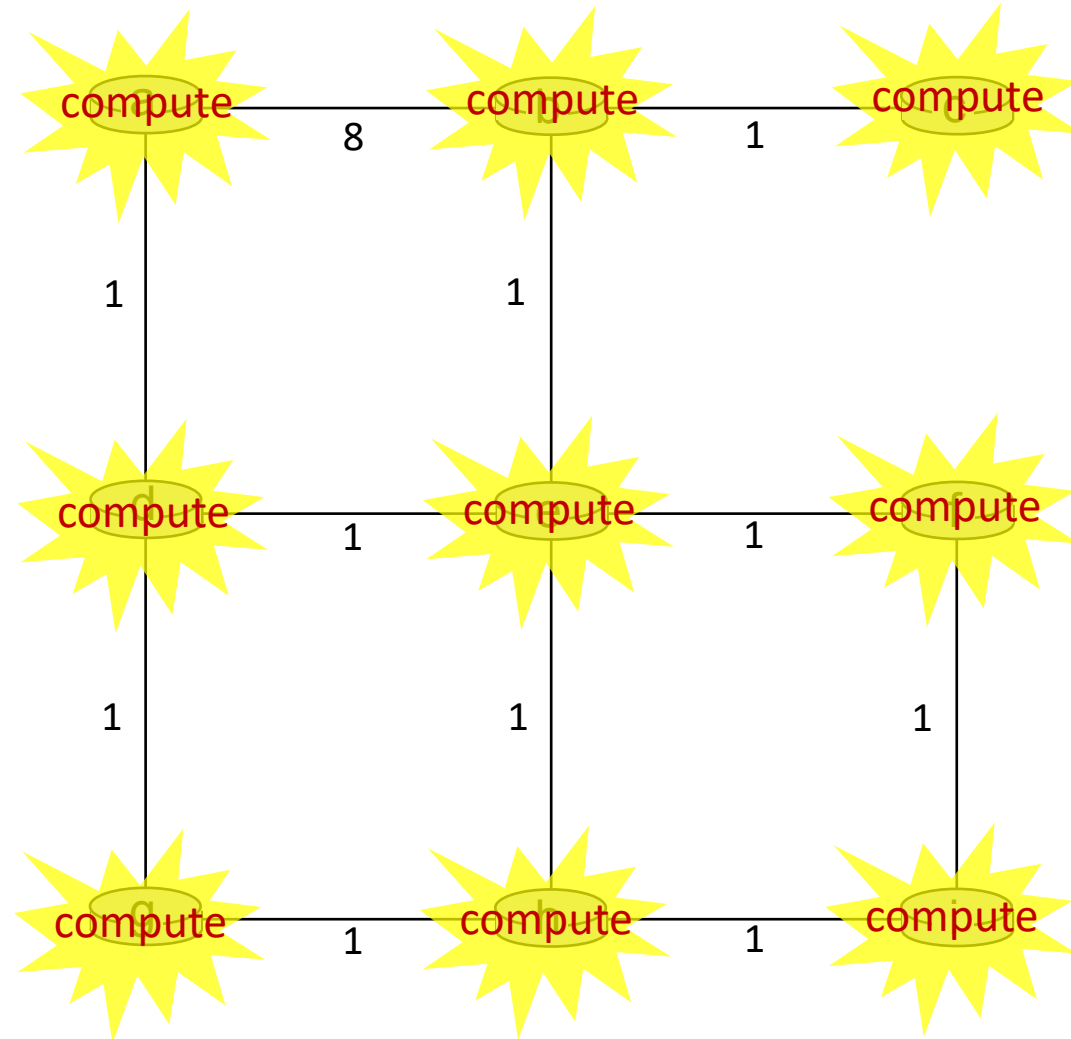
# Bellman-Ford Algorithm: how iterations work



t=1

All nodes:

- receive distance vectors from neighbors
- compute their new local distance vector
- send their new local distance vector to neighbors



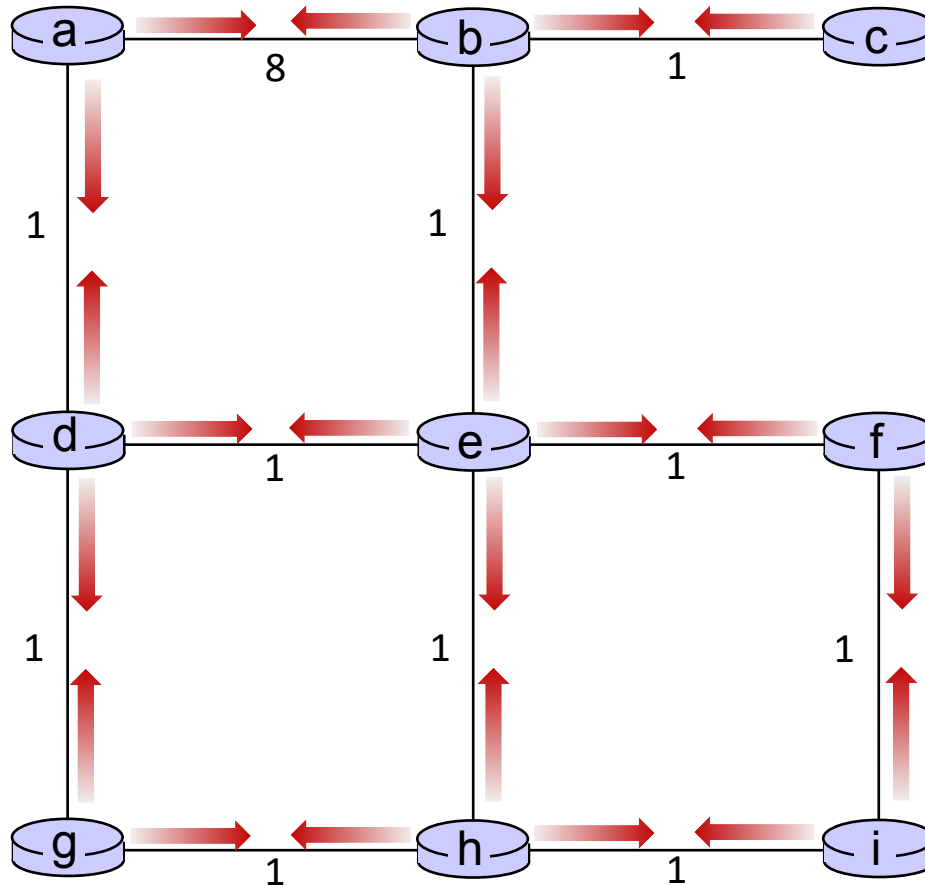
# Bellman-Ford Algorithm: how iterations work



t=1

All nodes:

- receive distance vectors from neighbors
- compute their new local distance vector
- send their new local distance vector to neighbors



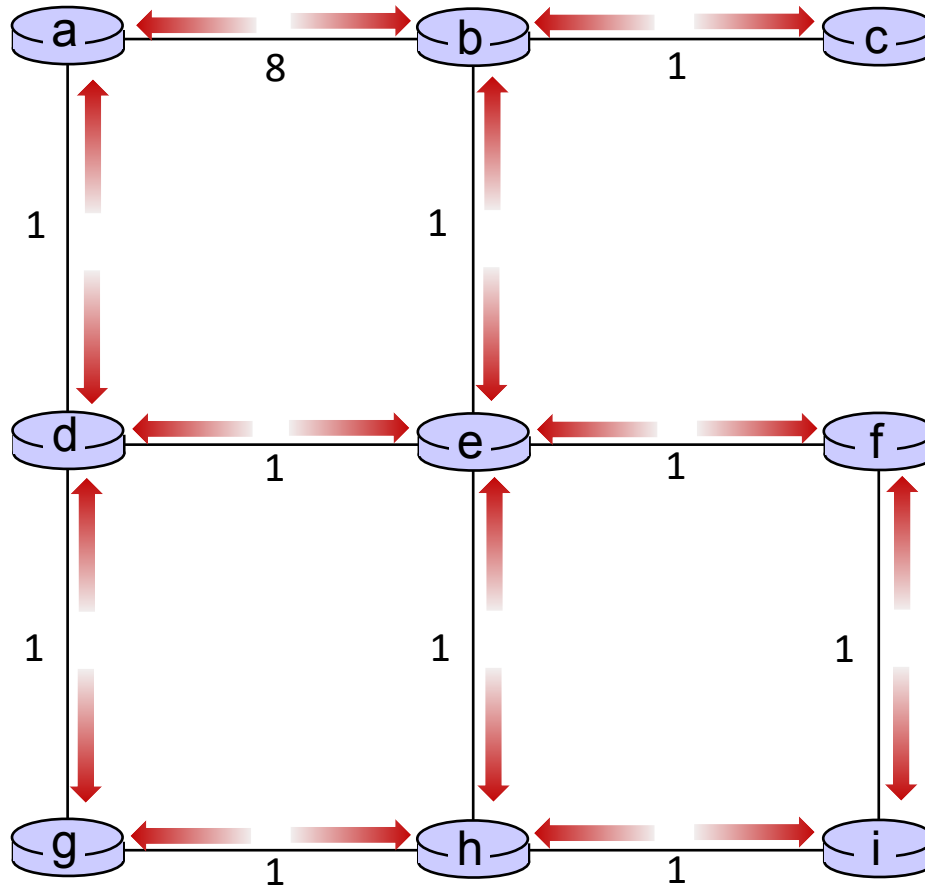
# Bellman-Ford Algorithm: how iterations work



t=2

All nodes:

- receive distance vectors from neighbors
- compute their new local distance vector
- send their new local distance vector to neighbors



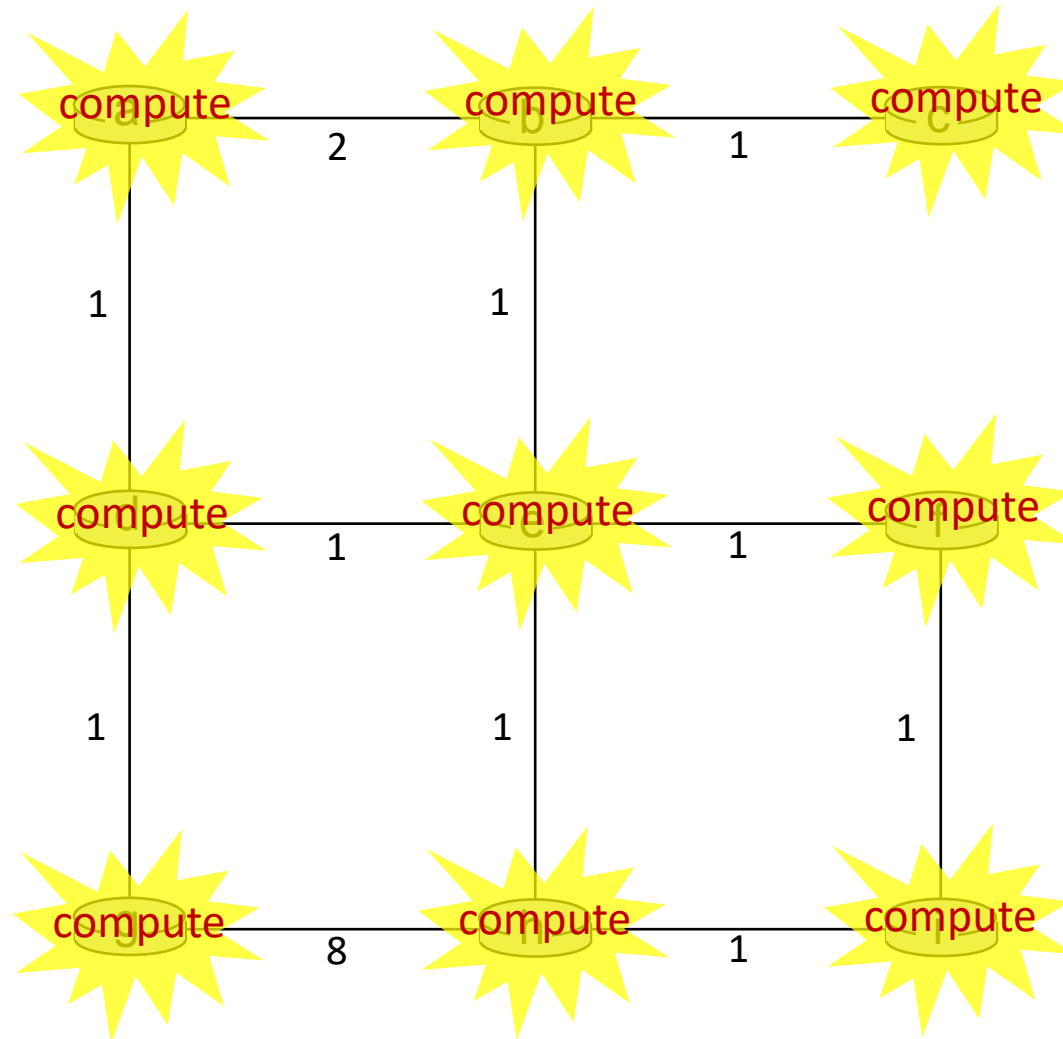
# Bellman-Ford Algorithm: how iterations work



t=2

All nodes:

- receive distance vectors from neighbors
- compute their new local distance vector
- send their new local distance vector to neighbors



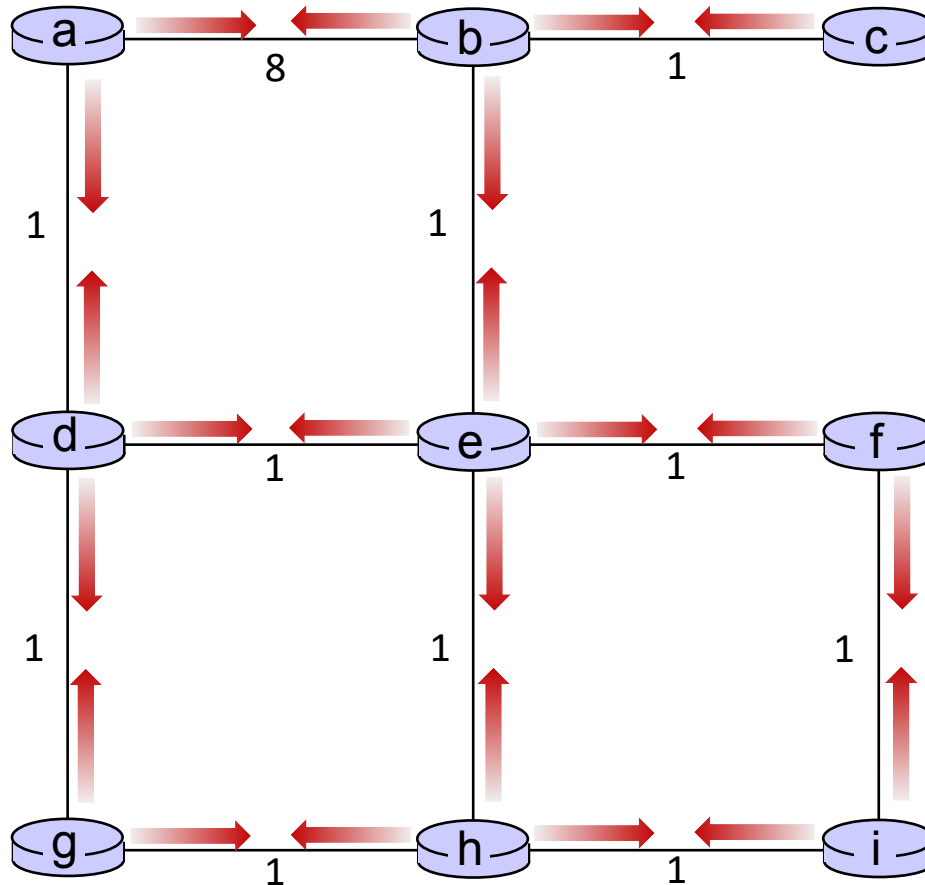
# Bellman-Ford Algorithm: how iterations work



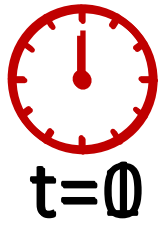
t=2

All nodes:

- receive distance vectors from neighbors
- compute their new local distance vector
- send their new local distance vector to neighbors



# Bellman-Ford Computations

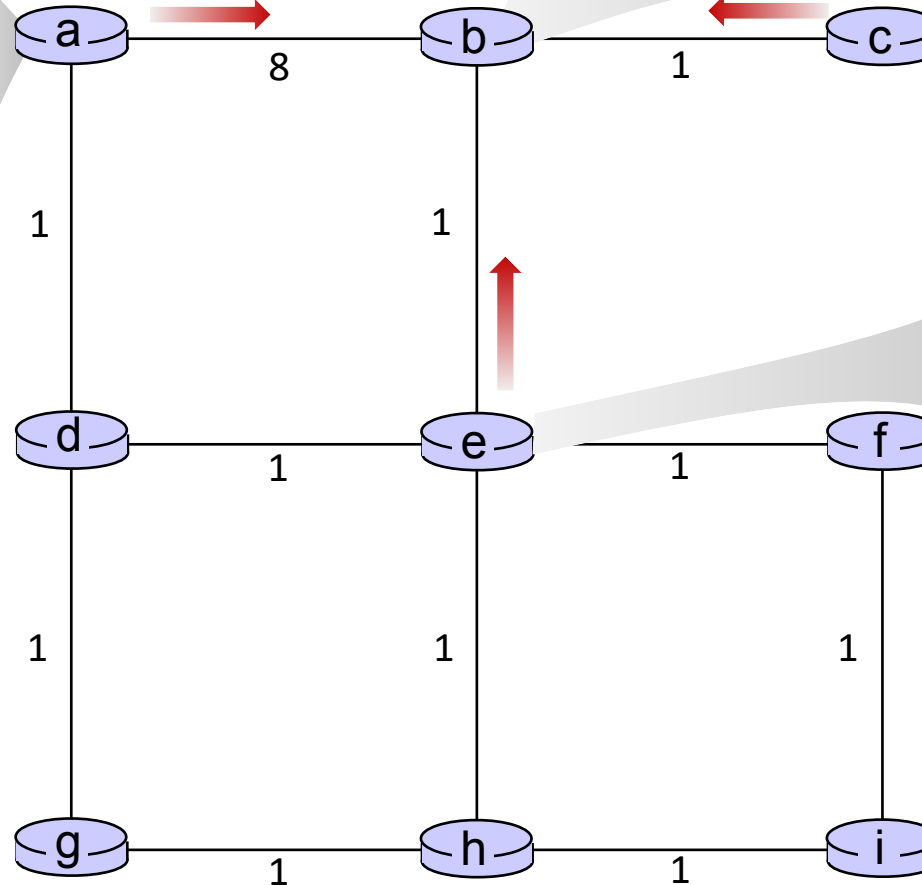


- b receives DVs from a, c, e

DV in a:
$D_a(a)=0$
$D_a(b)=8$
$D_a(c)=\infty$
$D_a(d)=1$
$D_a(e)=\infty$
$D_a(f)=\infty$
$D_a(g)=\infty$
$D_a(h)=\infty$
$D_a(i)=\infty$

DV in b:	
$D_b(a) = 8$	$D_b(f) = \infty$
$D_b(c) = 1$	$D_b(g) = \infty$
$D_b(d) = \infty$	$D_b(h) = \infty$
$D_b(e) = 1$	$D_b(i) = \infty$

DV in c:
$D_c(a)=\infty$
$D_c(b)=1$
$D_c(c)=0$
$D_c(d)=\infty$
$D_c(e)=\infty$
$D_c(f)=\infty$
$D_c(g)=\infty$
$D_c(h)=\infty$
$D_c(i)=\infty$



DV in e:
$D_e(a)=\infty$
$D_e(b)=1$
$D_e(c)=\infty$
$D_e(d)=1$
$D_e(e)=0$
$D_e(f)=1$
$D_e(g)=\infty$
$D_e(h)=1$
$D_e(i)=\infty$

# Bellman-Ford Computations



$t=1$

- b receives DVs from a, c, e, computes:

$$\begin{aligned}
 D_b(a) &= \min\{c_{b,a} + D_a(a), c_{b,c} + D_c(a), c_{b,e} + D_e(a)\} = \min\{8, \infty, \infty\} = 8 \\
 D_b(c) &= \min\{c_{b,a} + D_a(c), c_{b,c} + D_c(c), c_{b,e} + D_e(c)\} = \min\{\infty, 1, \infty\} = 1 \\
 D_b(d) &= \min\{c_{b,a} + D_a(d), c_{b,c} + D_c(d), c_{b,e} + D_e(d)\} = \min\{9, 2, \infty\} = 2 \\
 D_b(e) &= \min\{c_{b,a} + D_a(e), c_{b,c} + D_c(e), c_{b,e} + D_e(e)\} = \min\{\infty, \infty, 1\} = 1 \\
 D_b(f) &= \min\{c_{b,a} + D_a(f), c_{b,c} + D_c(f), c_{b,e} + D_e(f)\} = \min\{\infty, \infty, 2\} = 2 \\
 D_b(g) &= \min\{c_{b,a} + D_a(g), c_{b,c} + D_c(g), c_{b,e} + D_e(g)\} = \min\{\infty, \infty, \infty\} = \infty \\
 D_b(h) &= \min\{c_{b,a} + D_a(h), c_{b,c} + D_c(h), c_{b,e} + D_e(h)\} = \min\{\infty, \infty, 2\} = 2 \\
 D_b(i) &= \min\{c_{b,a} + D_a(i), c_{b,c} + D_c(i), c_{b,e} + D_e(i)\} = \min\{\infty, \infty, \infty\} = \infty
 \end{aligned}$$

DV in a:
$D_a(a)=0$
$D_a(b)=8$
$D_a(c)=\infty$
$D_a(d)=1$
$D_a(e)=\infty$
$D_a(f)=\infty$
$D_a(g)=\infty$
$D_a(h)=\infty$
$D_a(i)=\infty$

a

8

b compute

1

c

e

1

DV in b:	
$D_b(a) = 8$	$D_b(f) = \infty$
$D_b(c) = 1$	$D_b(g) = \infty$
$D_b(d) = \infty$	$D_b(h) = \infty$
$D_b(e) = 1$	$D_b(i) = \infty$

DV in c:
$D_c(a)=\infty$
$D_c(b)=1$
$D_c(c)=0$
$D_c(d)=\infty$
$D_c(e)=\infty$
$D_c(f)=\infty$
$D_c(g)=\infty$
$D_c(h)=\infty$
$D_c(i)=\infty$

DV in e:
$D_e(a)=\infty$
$D_e(b)=1$
$D_e(c)=\infty$
$D_e(d)=1$
$D_e(e)=0$
$D_e(f)=1$
$D_e(g)=\infty$
$D_e(h)=1$
$D_e(i)=\infty$

New DV in b

## DV in b:

$D_b(a) = 8$

$D_b(c) = 1$

$D_b(d) = 2$

$D_b(e) = 1$

$D_b(f) = 2$

$D_b(g) = \infty$

$D_b(h) = 2$

$D_b(i) = \infty$



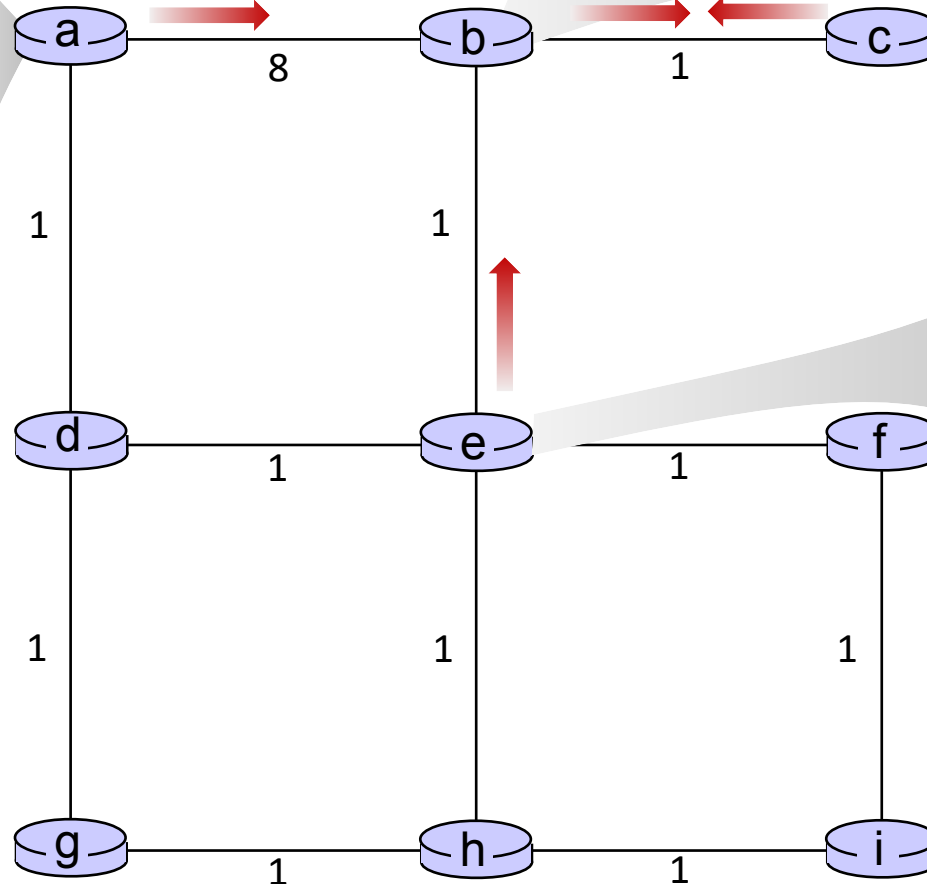
# Bellman-Ford Computations



$t=1$

- c receives DVs from b

DV in a:
$D_a(a)=0$
$D_a(b)=8$
$D_a(c)=\infty$
$D_a(d)=1$
$D_a(e)=\infty$
$D_a(f)=\infty$
$D_a(g)=\infty$
$D_a(h)=\infty$
$D_a(i)=\infty$



DV in b:	
$D_b(a) = 8$	$D_b(f) = \infty$
$D_b(c) = 1$	$D_b(g) = \infty$
$D_b(d) = \infty$	$D_b(h) = \infty$
$D_b(e) = 1$	$D_b(i) = \infty$

DV in c:
$D_c(a)=\infty$
$D_c(b)=1$
$D_c(c)=0$
$D_c(d)=\infty$
$D_c(e)=\infty$
$D_c(f)=\infty$
$D_c(g)=\infty$
$D_c(h)=\infty$
$D_c(i)=\infty$

DV in e:
$D_e(a)=\infty$
$D_e(b)=1$
$D_e(c)=\infty$
$D_e(d)=1$
$D_e(e)=0$
$D_e(f)=1$
$D_e(g)=\infty$
$D_e(h)=1$
$D_e(i)=\infty$

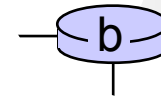
# Bellman-Ford Computations



t=1

- c receives DVs from b computes:

$$\begin{aligned}
 D_c(a) &= \min\{c_{c,b} + D_b(a)\} = 1 + 8 = 9 \\
 D_c(b) &= \min\{c_{c,b} + D_b(b)\} = 1 + 0 = 1 \\
 D_c(d) &= \min\{c_{c,b} + D_b(d)\} = 1 + \infty = \infty \\
 D_c(e) &= \min\{c_{c,b} + D_b(e)\} = 1 + 1 = 2 \\
 D_c(f) &= \min\{c_{c,b} + D_b(f)\} = 1 + \infty = \infty \\
 D_c(g) &= \min\{c_{c,b} + D_b(g)\} = 1 + \infty = \infty \\
 D_c(h) &= \min\{c_{c,b} + D_b(h)\} = 1 + \infty = \infty \\
 D_c(i) &= \min\{c_{c,b} + D_b(i)\} = 1 + \infty = \infty
 \end{aligned}$$



1

compute

DV in b:

$D_b(a) = 8$	$D_b(f) = \infty$
$D_b(c) = 1$	$D_b(g) = \infty$
$D_b(d) = \infty$	$D_b(h) = \infty$
$D_b(e) = 1$	$D_b(i) = \infty$

DV in c:

$D_c(a) = \infty$
$D_c(b) = 1$
$D_c(c) = 0$
$D_c(d) = \infty$
$D_c(e) = \infty$
$D_c(f) = \infty$
$D_c(g) = \infty$
$D_c(h) = \infty$
$D_c(i) = \infty$






New DV in c

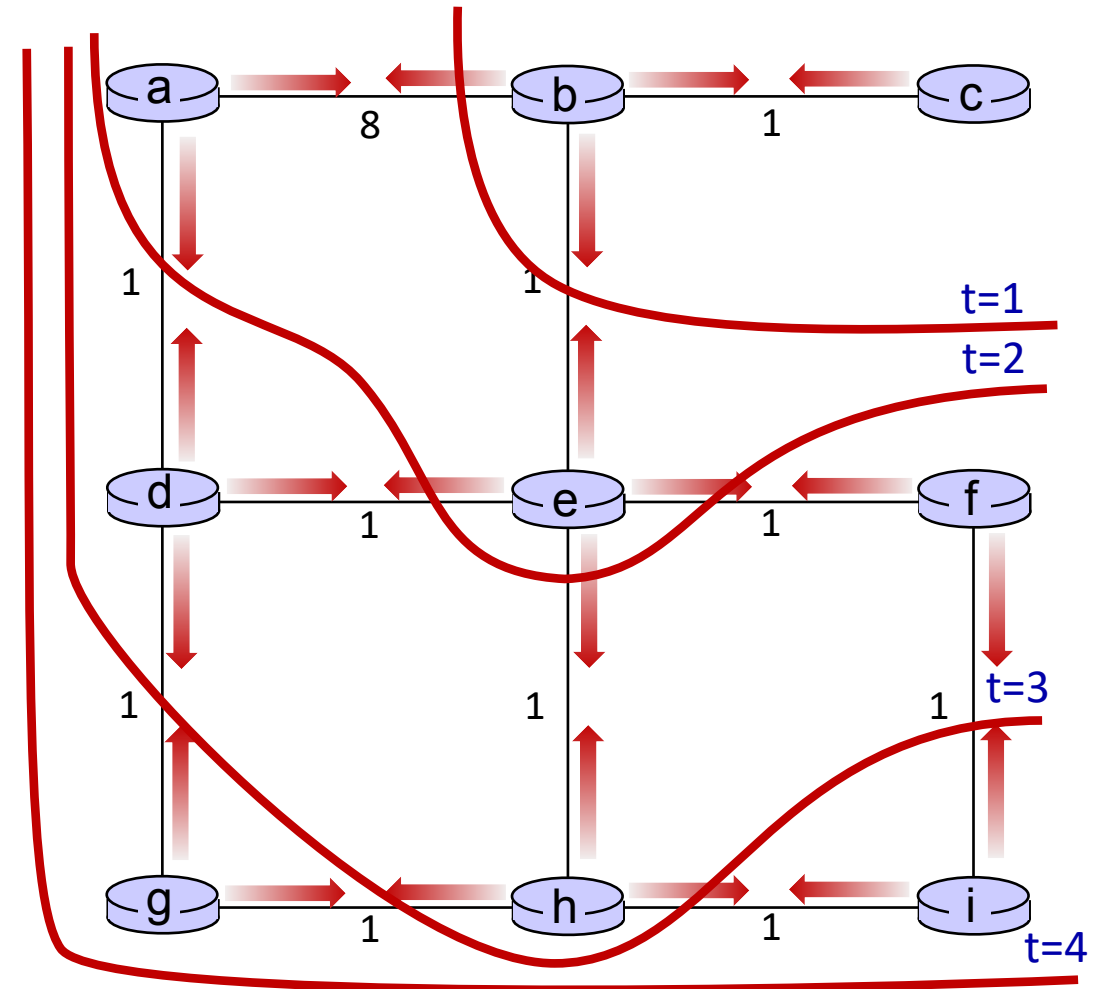
DV in c:

$D_c(a) = 9$
$D_c(b) = 1$
$D_c(c) = 0$
$D_c(d) = \infty$
$D_c(e) = 2$
$D_c(f) = \infty$
$D_c(g) = \infty$
$D_c(h) = \infty$
$D_c(i) = \infty$

# Bellman-Ford: Iterative Information Propagation

Iterative communication, computation steps diffuses information through network:

-   $t=0$  c's state at  $t=0$  is at c only
-   $t=1$  c's state at  $t=0$  has propagated to b, and may influence distance vector computations up to **1** hop away, i.e., at b
-   $t=2$  c's state at  $t=0$  may now influence distance vector computations up to **2** hops away, i.e., at b and now at a, e as well
-   $t=3$  c's state at  $t=0$  may influence distance vector computations up to **3** hops away, i.e., at d, f, h
-   $t=4$  c's state at  $t=0$  may influence distance vector computations up to **4** hops away, i.e., at g, i



# Comparing Dijkstra and Bellman-Ford Algorithms

	Dijkstra (LS)	Bellman-Ford (DV)
Algorithm structure	Centralized	Decentralized
Speed of convergence	$O(N^2)$	slower than Dijkstra; $O(N \cdot E)$ in worst
Application	Routing within autonomous systems	Routing across autonomous systems
Robustness	Route oscillations	Routing loops; Count-to-infinity

*Exercise for you: read about these three routing problems from the textbook*

# **Spot Quiz (ICON)**