

# Decentralized Network Design

PhD Thesis Proposal  
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2/4/09

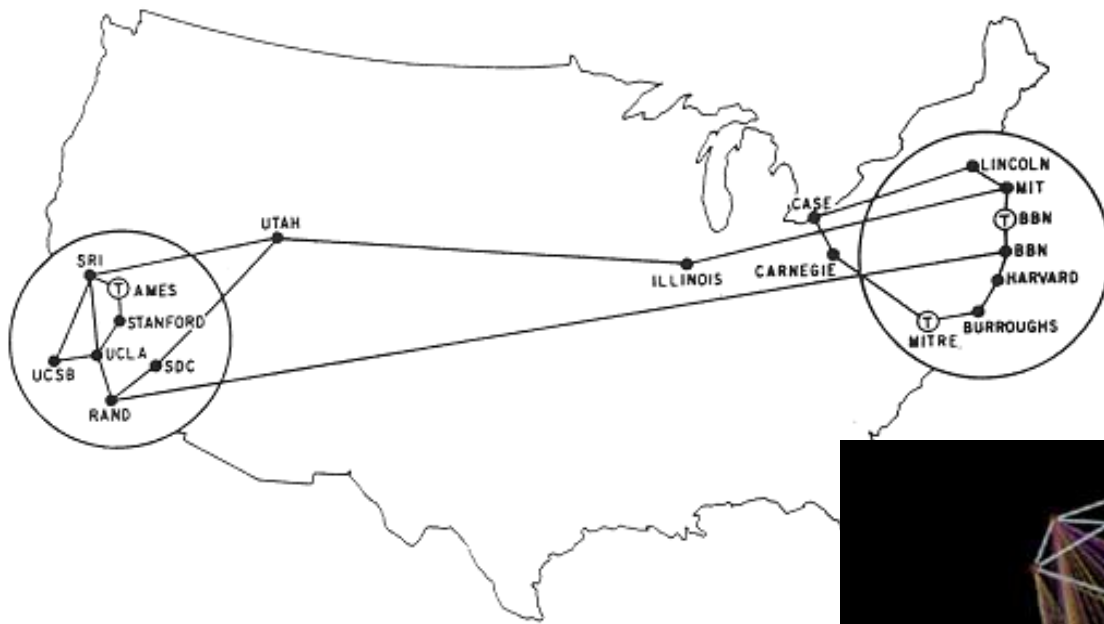
# Results Mentioned are from...

- Nikolaos Laoutaris, Laura J. Poplawski, Rajmohan Rajaraman, Ravi Sundaram, Shang-Hua Teng. *Bounded Budget Connection (BBC) Games or How to Make Friends and Influence People, on a Budget*. In PODC '08, pages 165–174, 2008.
- Nikolaos Laoutaris, Laura J. Poplawski, Rajmohan Rajaraman, Ravi Sundaram, Shang-Hua Teng. *Bounded Budget Connection (BBC) Games or How to make friends and influence people, on a budget*. arXiv:0806.1727v1 [cs.GT]
- Laura J. Poplawski, Rajmohan Rajaraman, Ravi Sundaram, Shang-Hua Teng. *Preference Games and Personalized Equilibria, with Applications to Fractional BGP*. arXiv:0812.0598v2 [cs.GT]

# Decentralization



# Decentralization



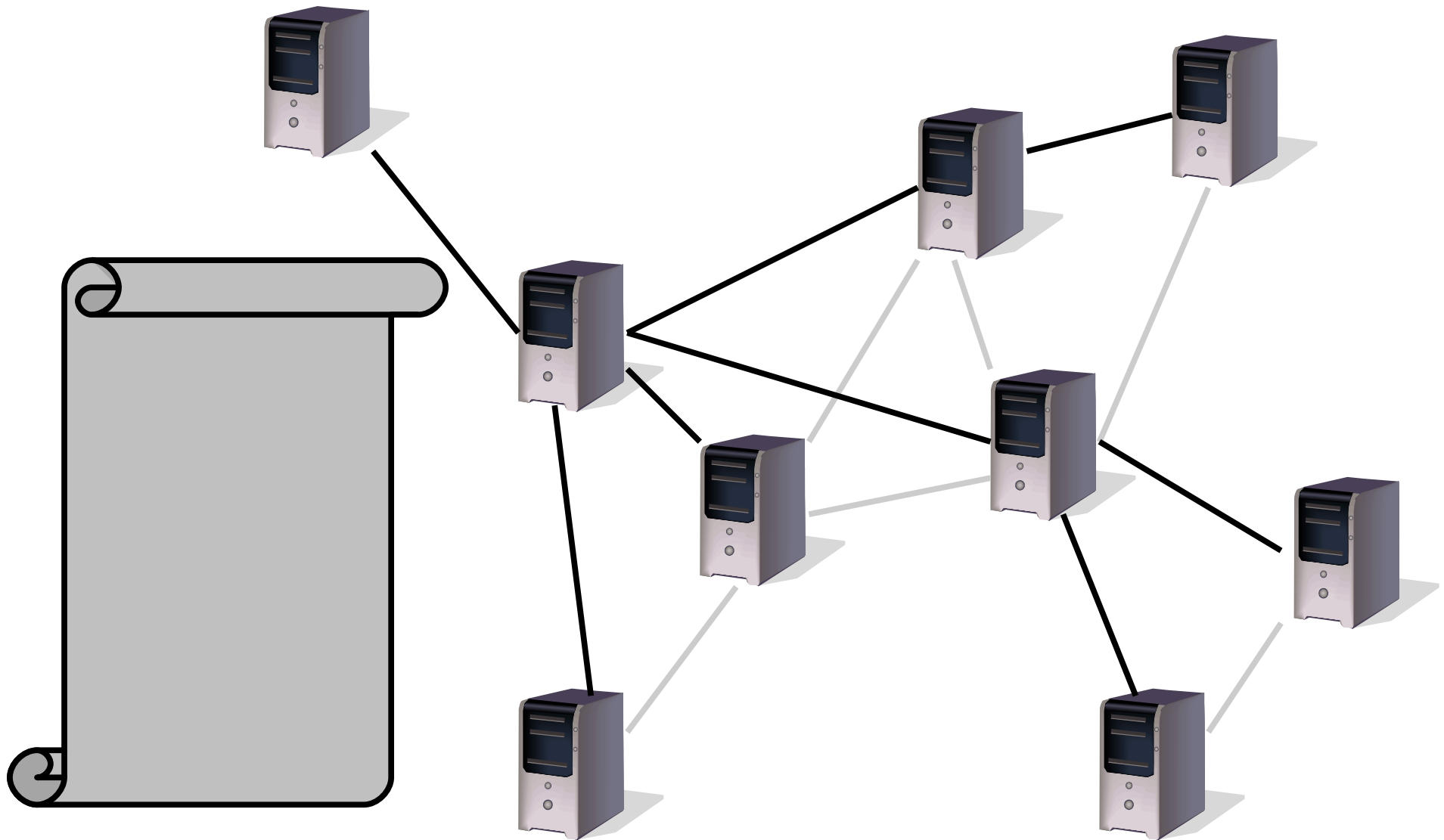
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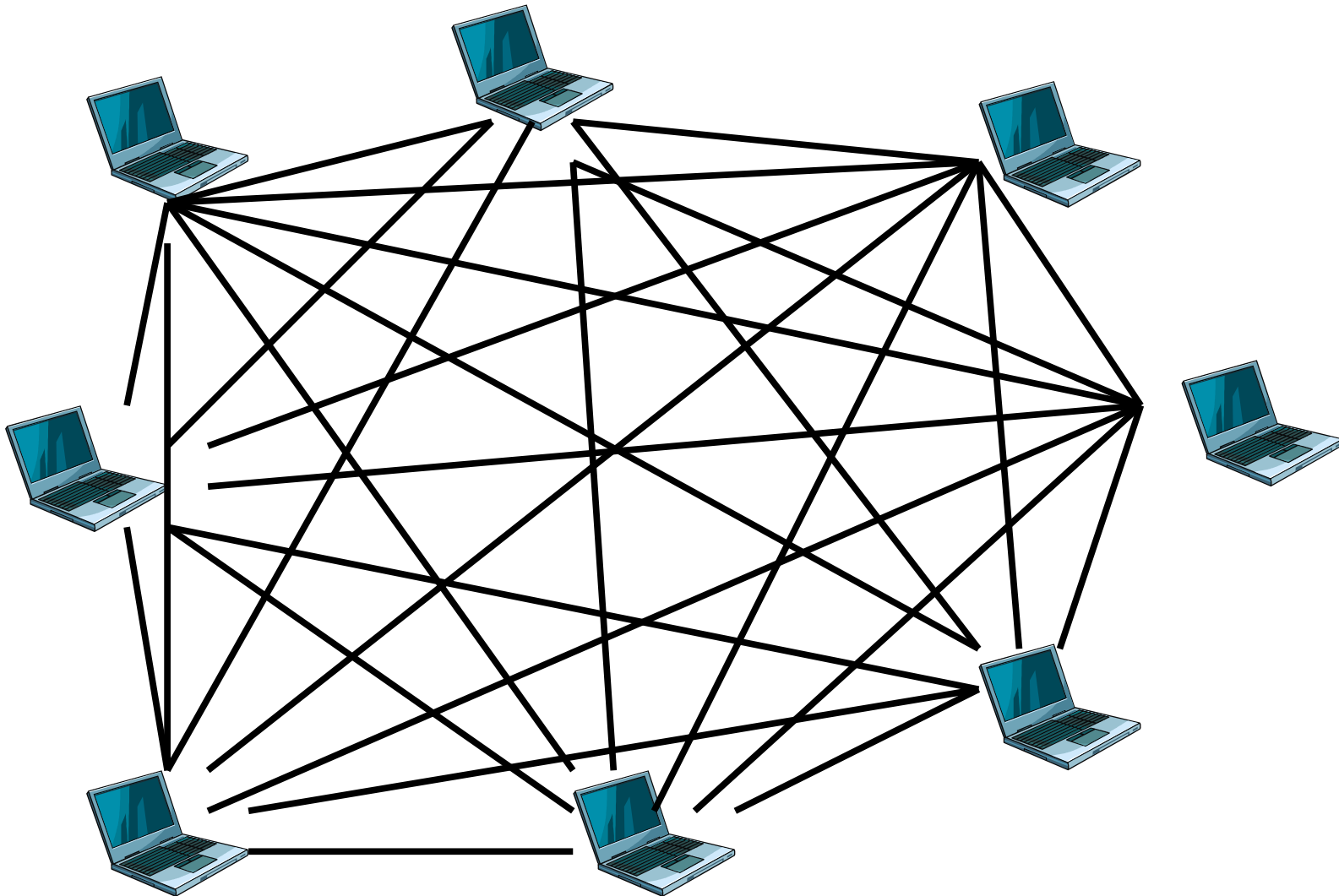
# Decentralizing Overlay Networks



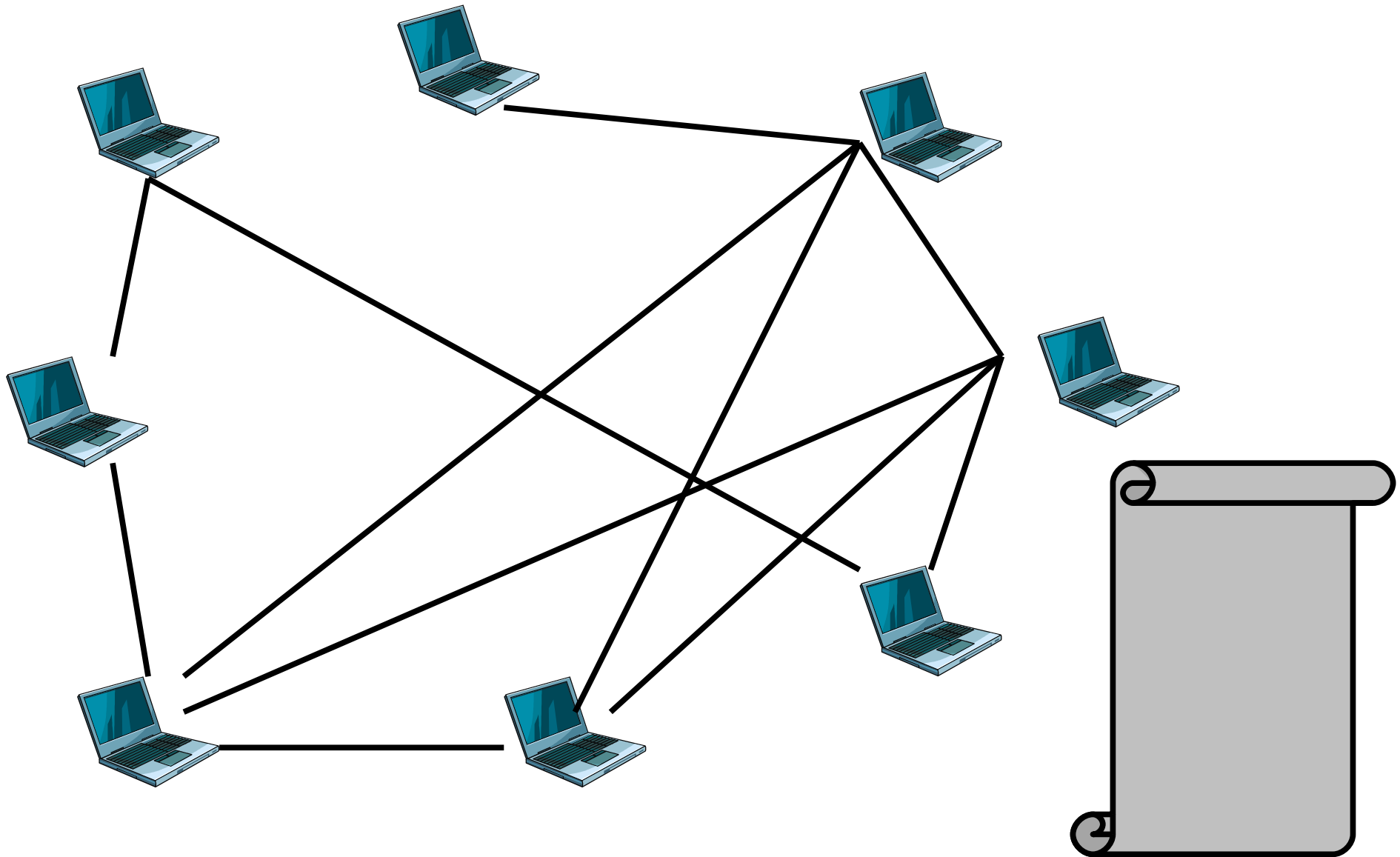
# Decentralizing Overlay Networks



# Decentralizing Overlay Networks

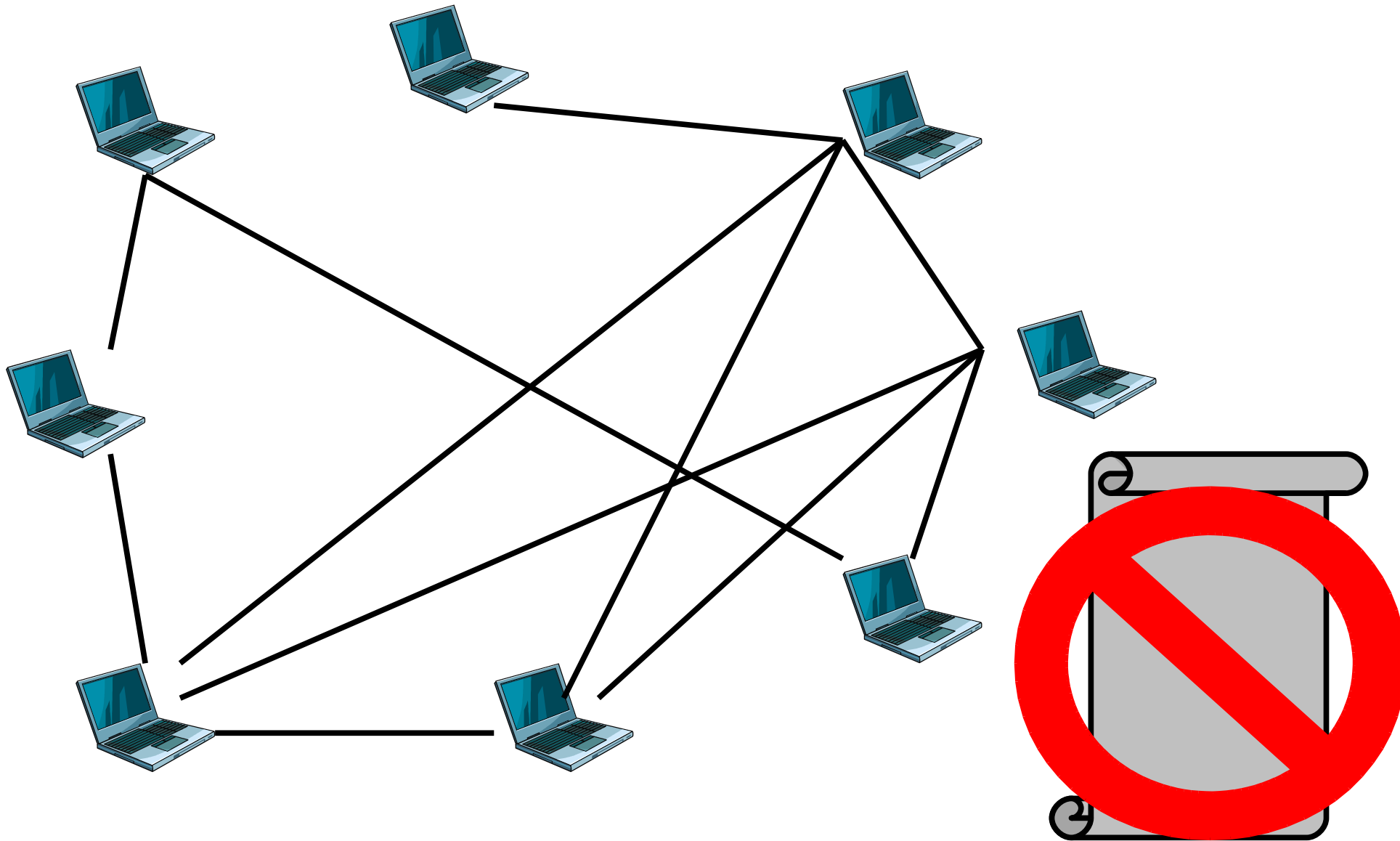


# Decentralizing Overlay Networks

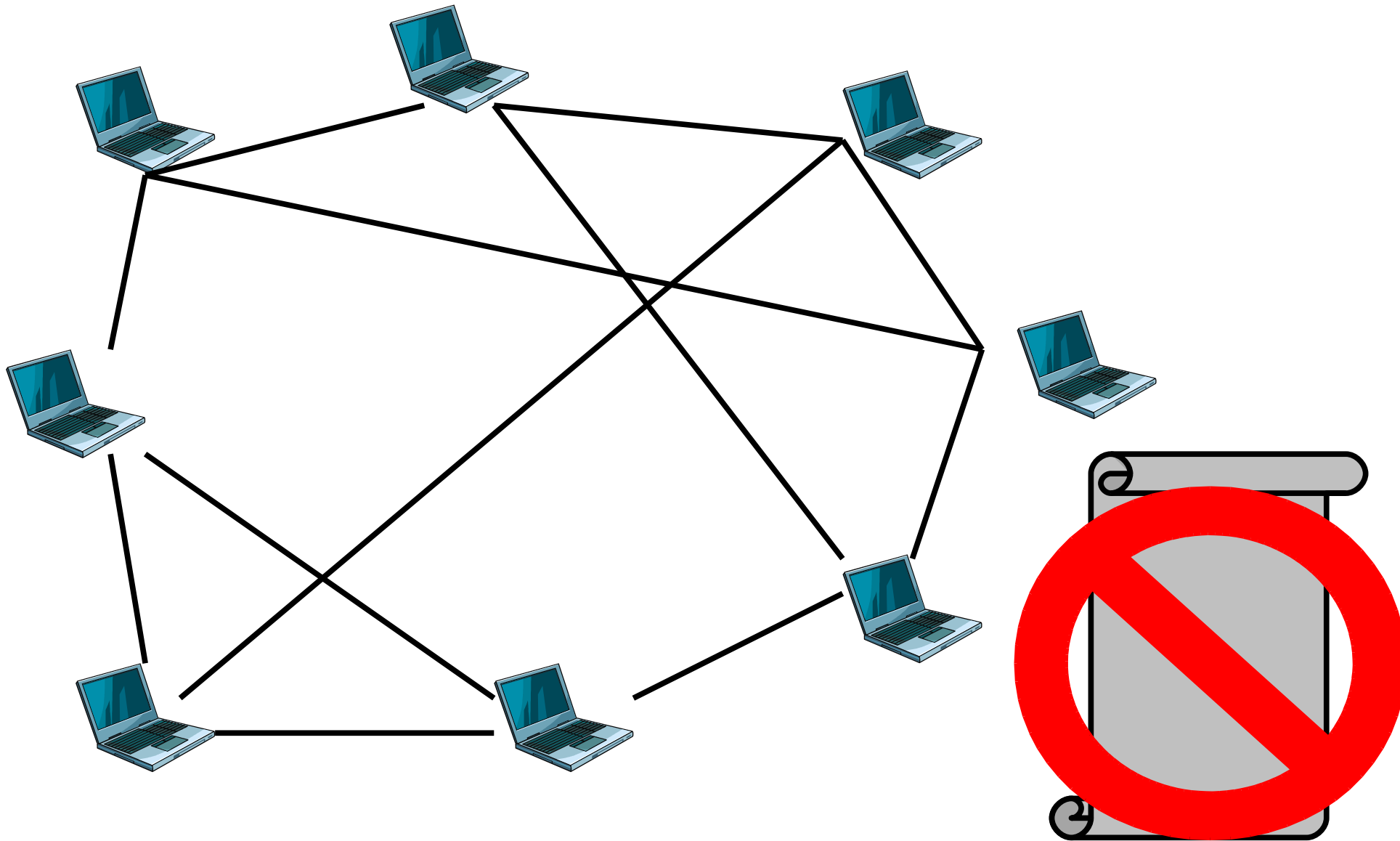




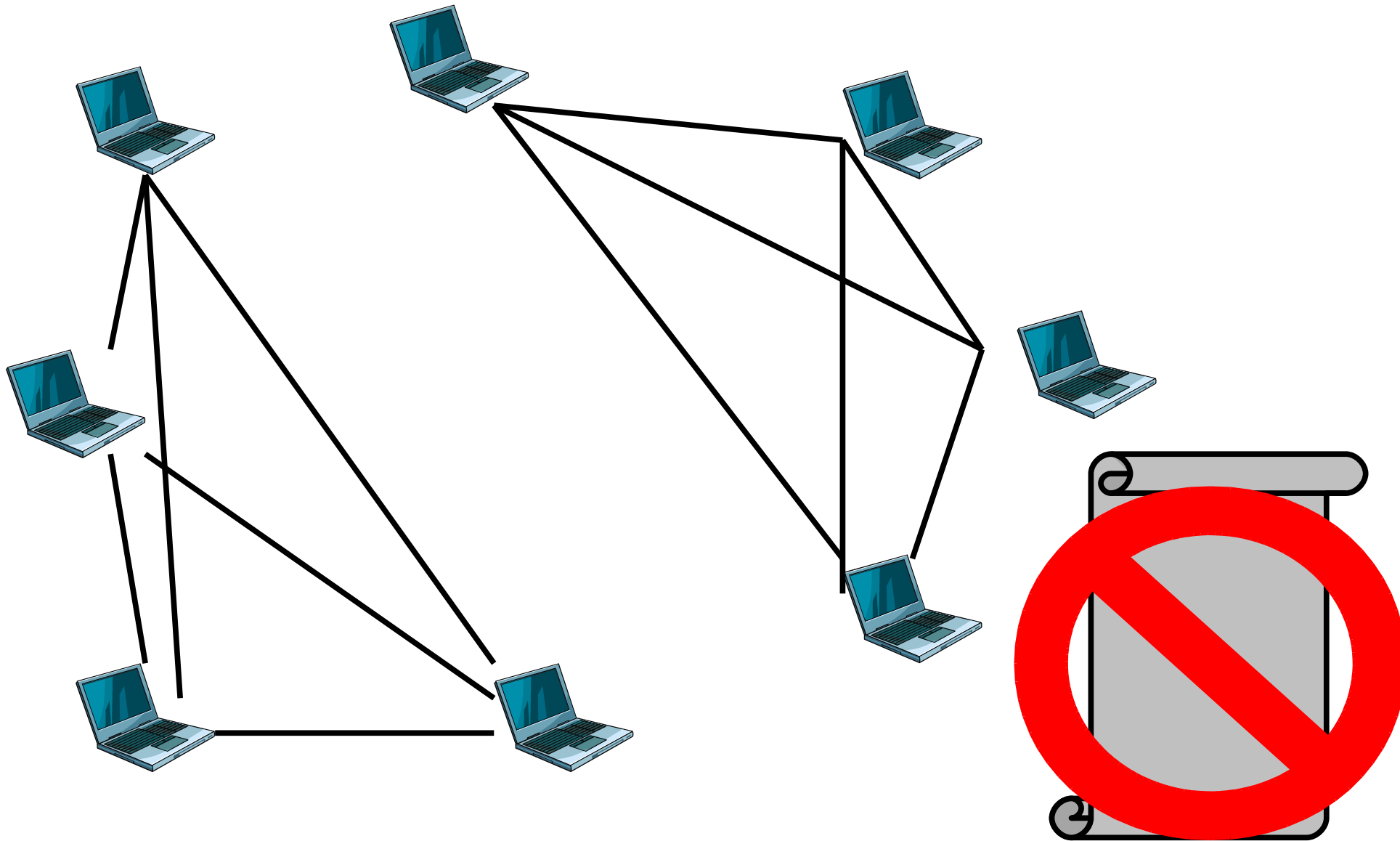
# Decentralizing Overlay Networks



# Decentralizing Overlay Networks



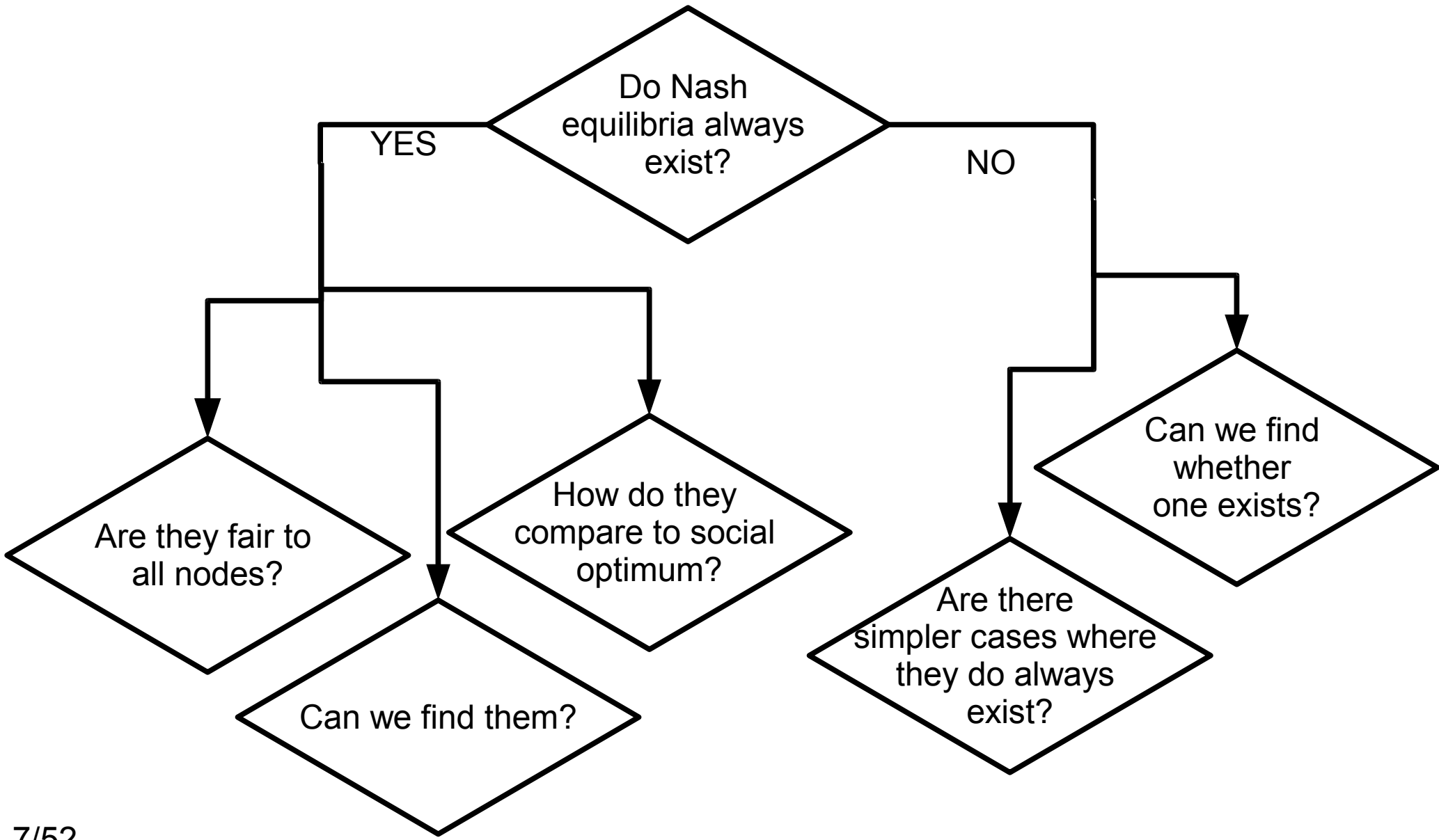
# Decentralizing Overlay Networks



# Techniques

- Algorithmic Game Theory
- First define a game:
  - Players = Nodes in the network
  - Actions = Connections they can make
  - Costs/Payoffs = How close am I to the other nodes?
- Then, study pure Nash equilibria
  - Do they always exist? Can we find them? What do they look like?
  - Only studying **pure** Nash equilibria

# Techniques

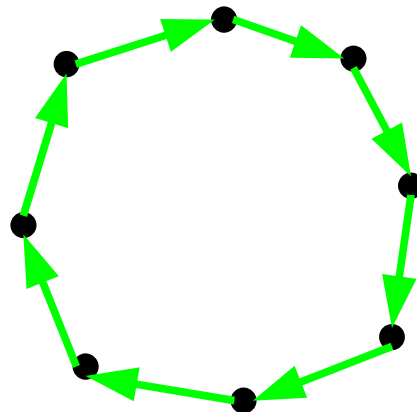


# Simplest Game

- Players = Nodes in the network
- Actions = Connections they can make
  - One edge to any other node
- Costs/Payoffs = How close am I to the other nodes?
  - Average hop-count distance to all other nodes

# Simplest Game

- Players = Nodes in the network
- Actions = Connections they can make
  - One edge to any other node
- Costs/Payoffs = How close am I to the other nodes?
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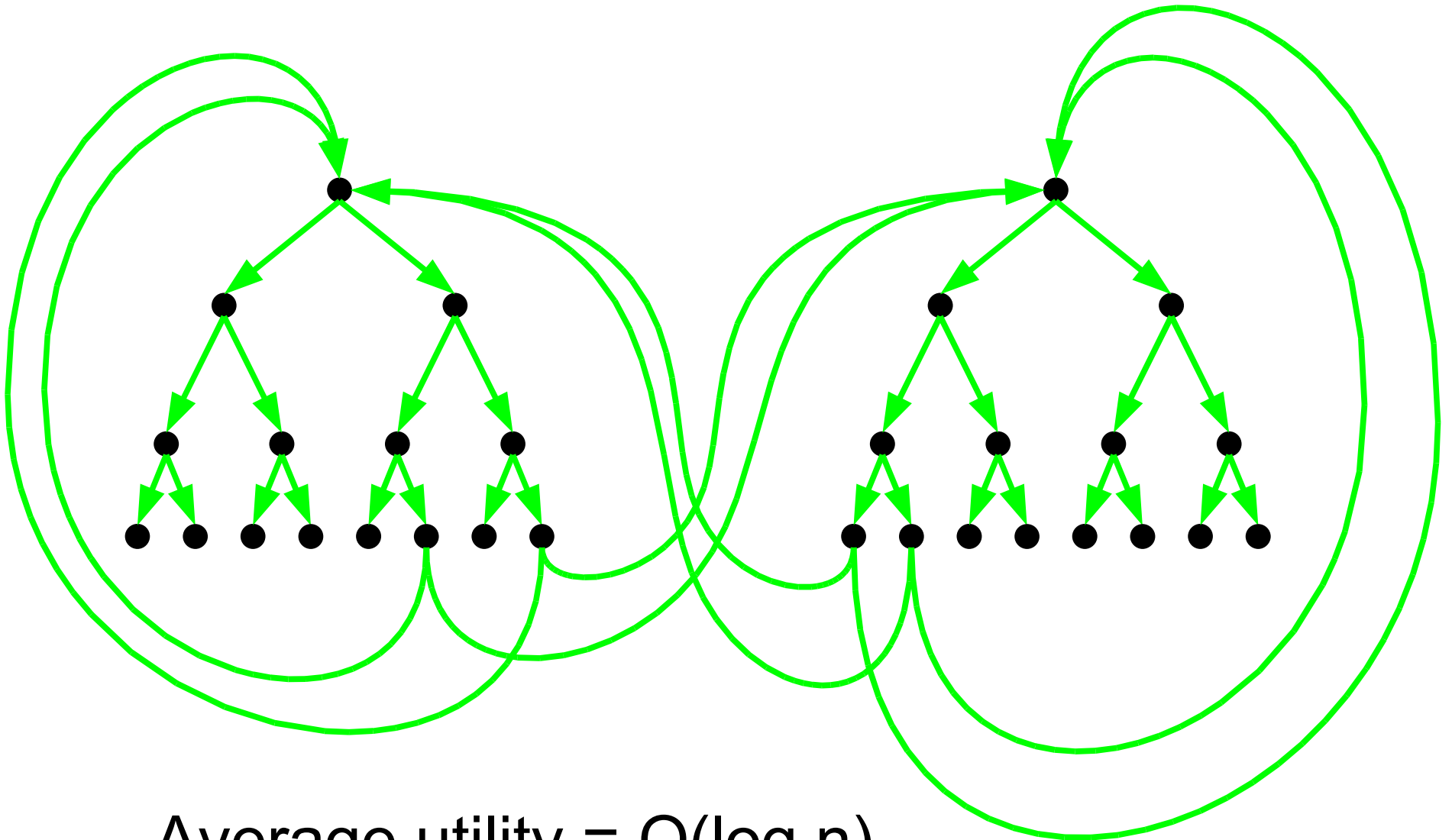


# 2 Connection Game

- Players = Nodes in the network
- Actions = Connections they can make
  - Two edges to any other node
- Costs/Payoffs = How close am I to the other nodes?
  - Average hop-count distance to all other nodes

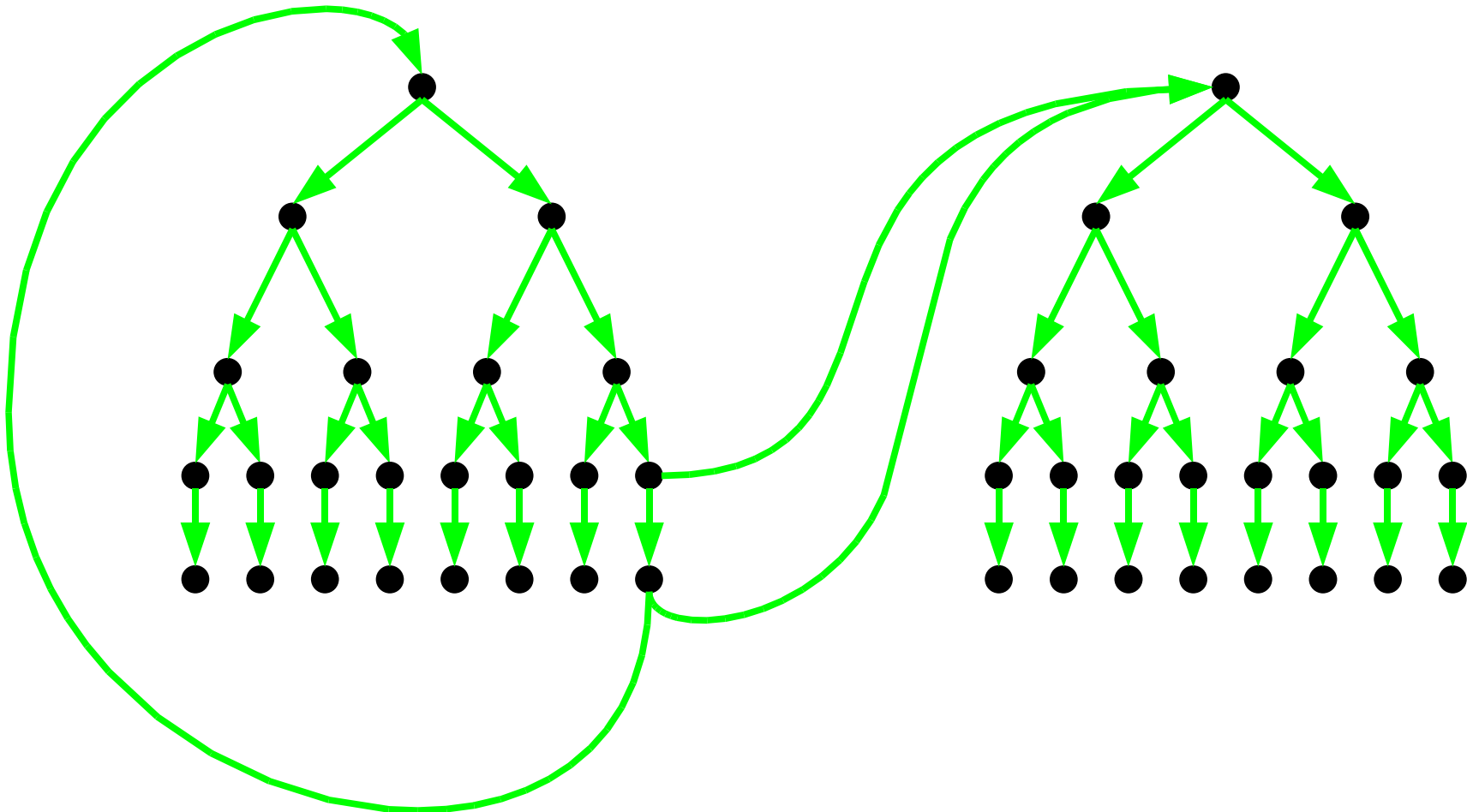


# 2 Connection Game

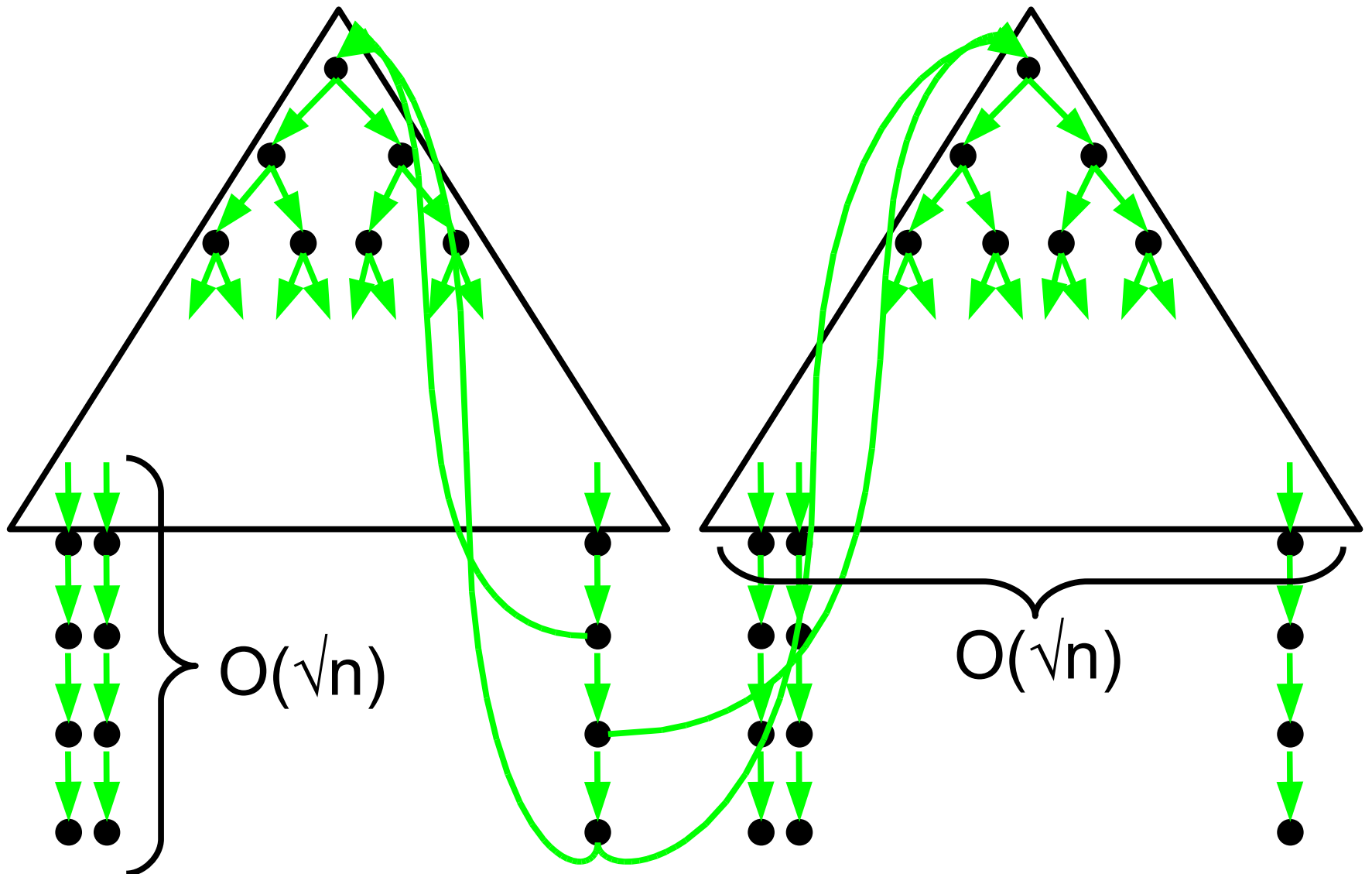


Average utility =  $O(\log n)$

# 2 Connection Game

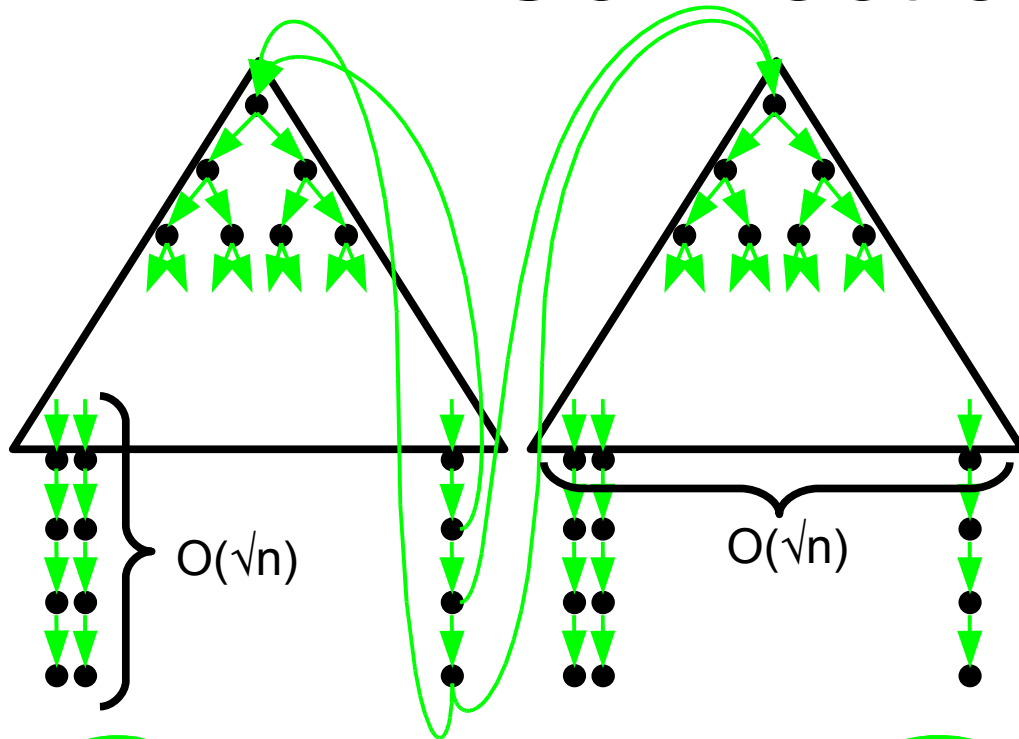


# 2 Connection Game

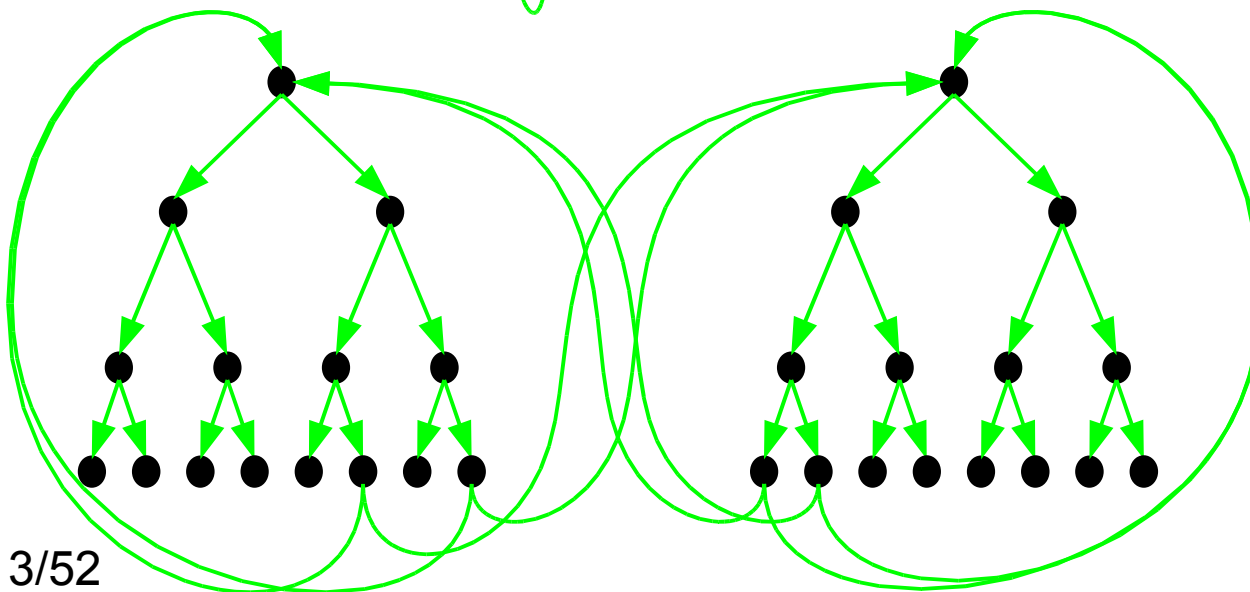


Average utility =  $O(\sqrt{n})$

# 2 Connection Game

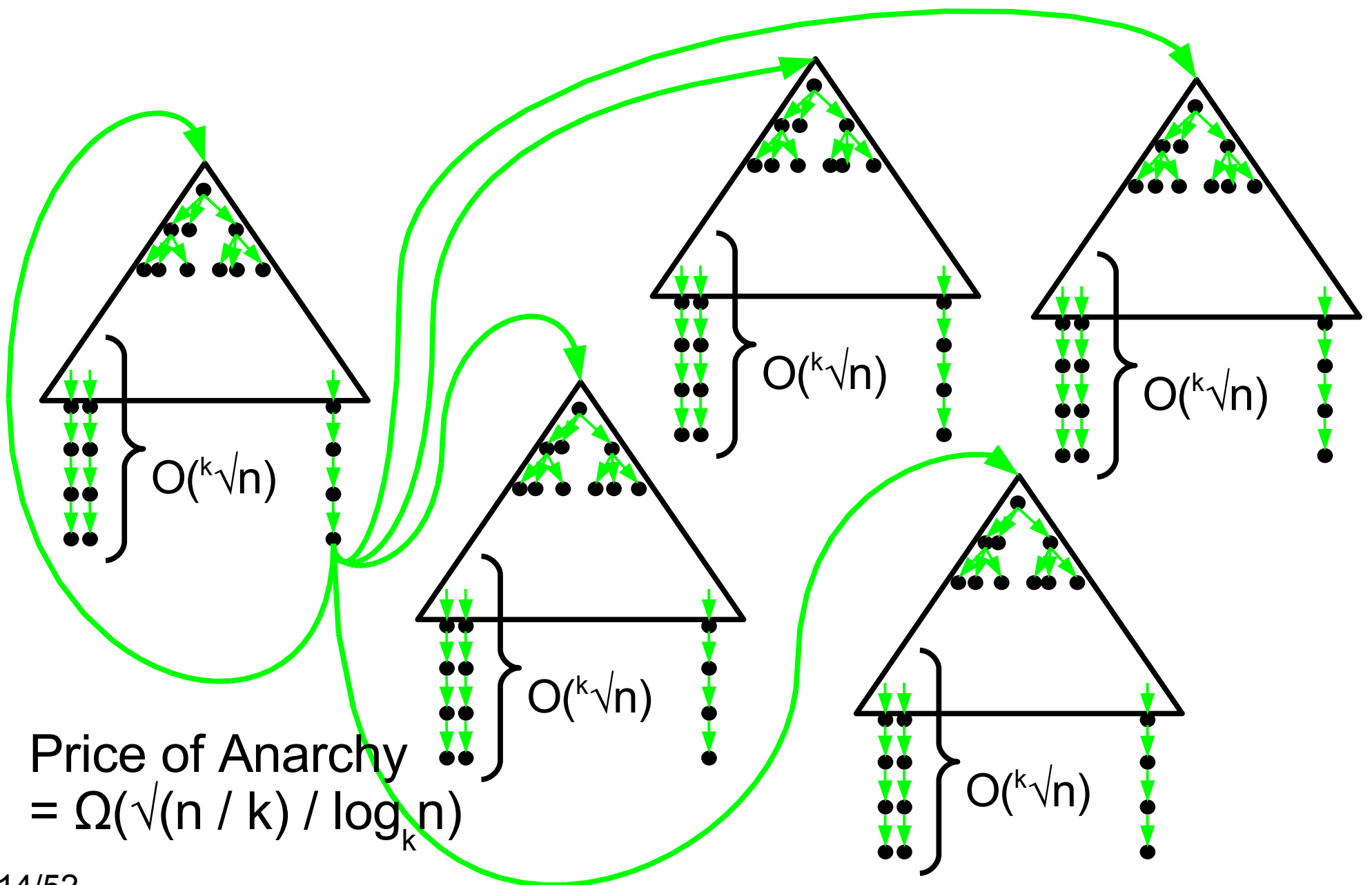


Average utility =  
 $O(\sqrt{n})$

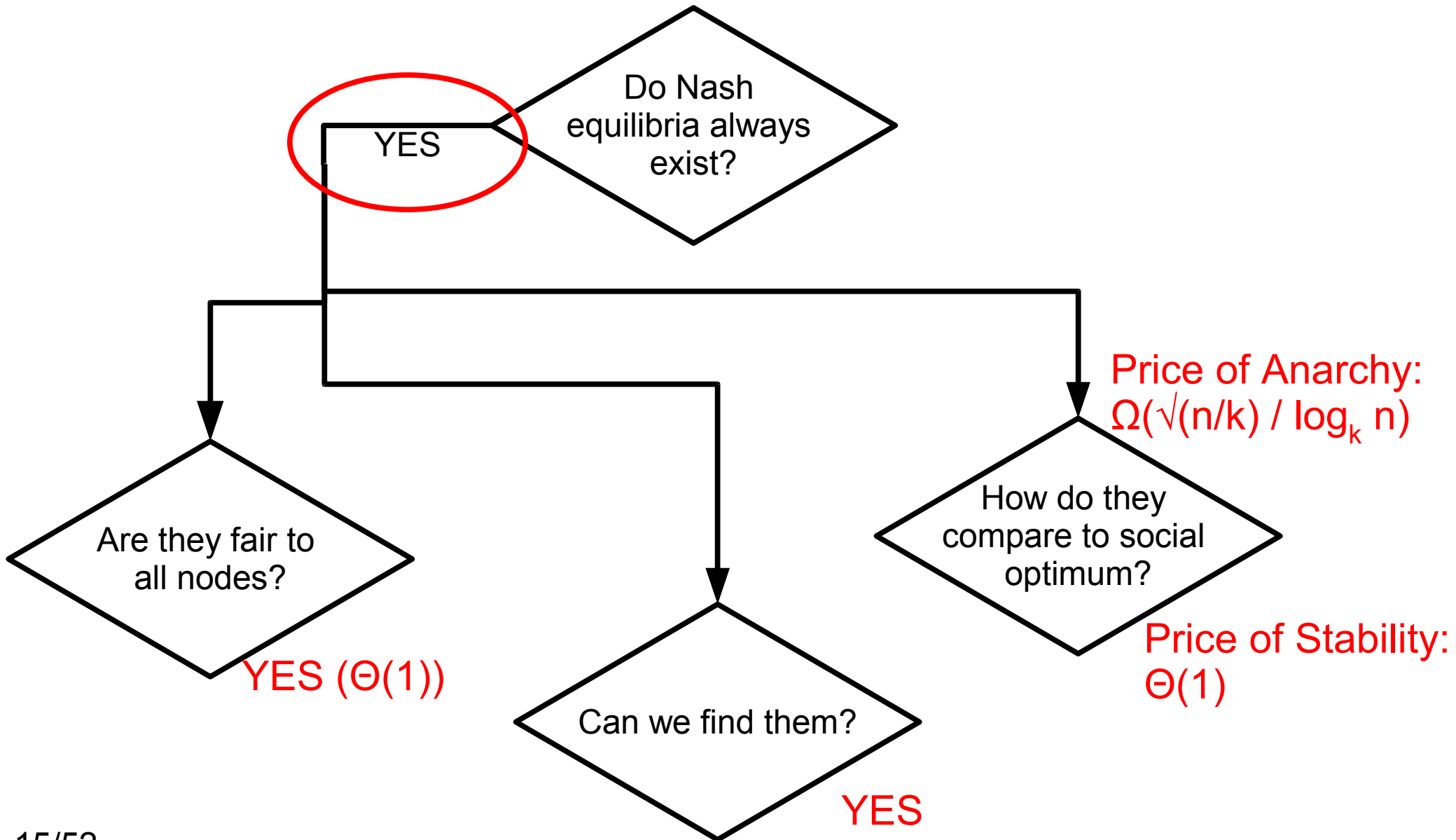


Average utility =  
 $O(\log n)$

# k-Connection Game



# k-Connection Game



# Bounded Budget Connection (BBC) Games

- Players = Nodes in the network
- Actions = Connections they can make
  - Budget to spent on edges
  - Cost for each edge
- Costs/Payoffs = How close am I to the other nodes?
  - Length on each edge
  - Affinity for each other node
  - Average affinity-weighted shortest path distance to all other nodes

# The Model

- Number of nodes
- Affinity for each directed pair of nodes
- Link cost for each directed pair of nodes
- Budget of allowed link cost per node,  $k(v)$
- Length metric from the perspective of each node
- Each node  $v$  spends  $\leq k(v)$  on links to minimize

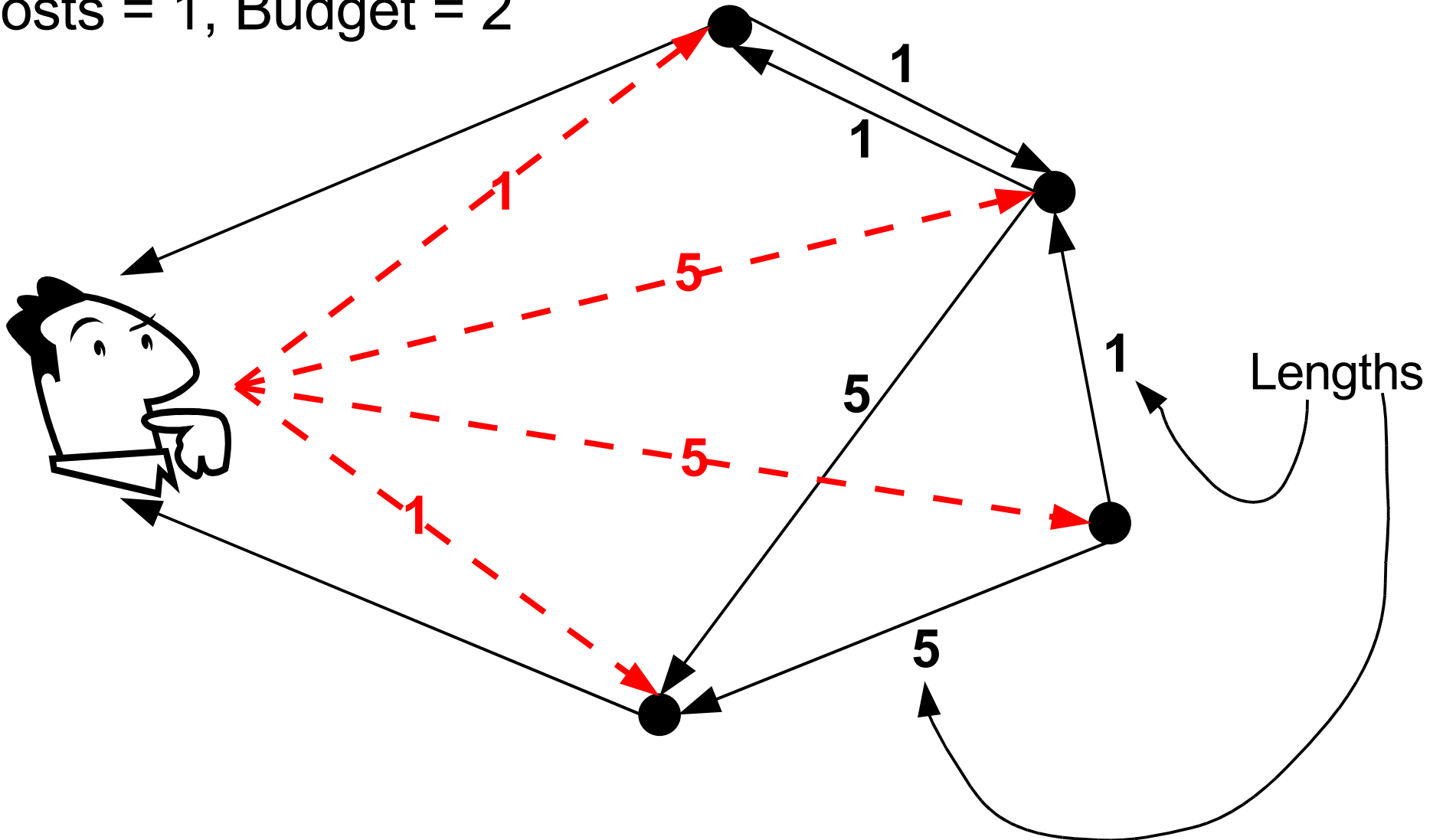
$$\sum_{\text{other nodes}} (\text{affinity} * \text{shortest path distance})$$

↑ or disconnection penalty if no path exists.



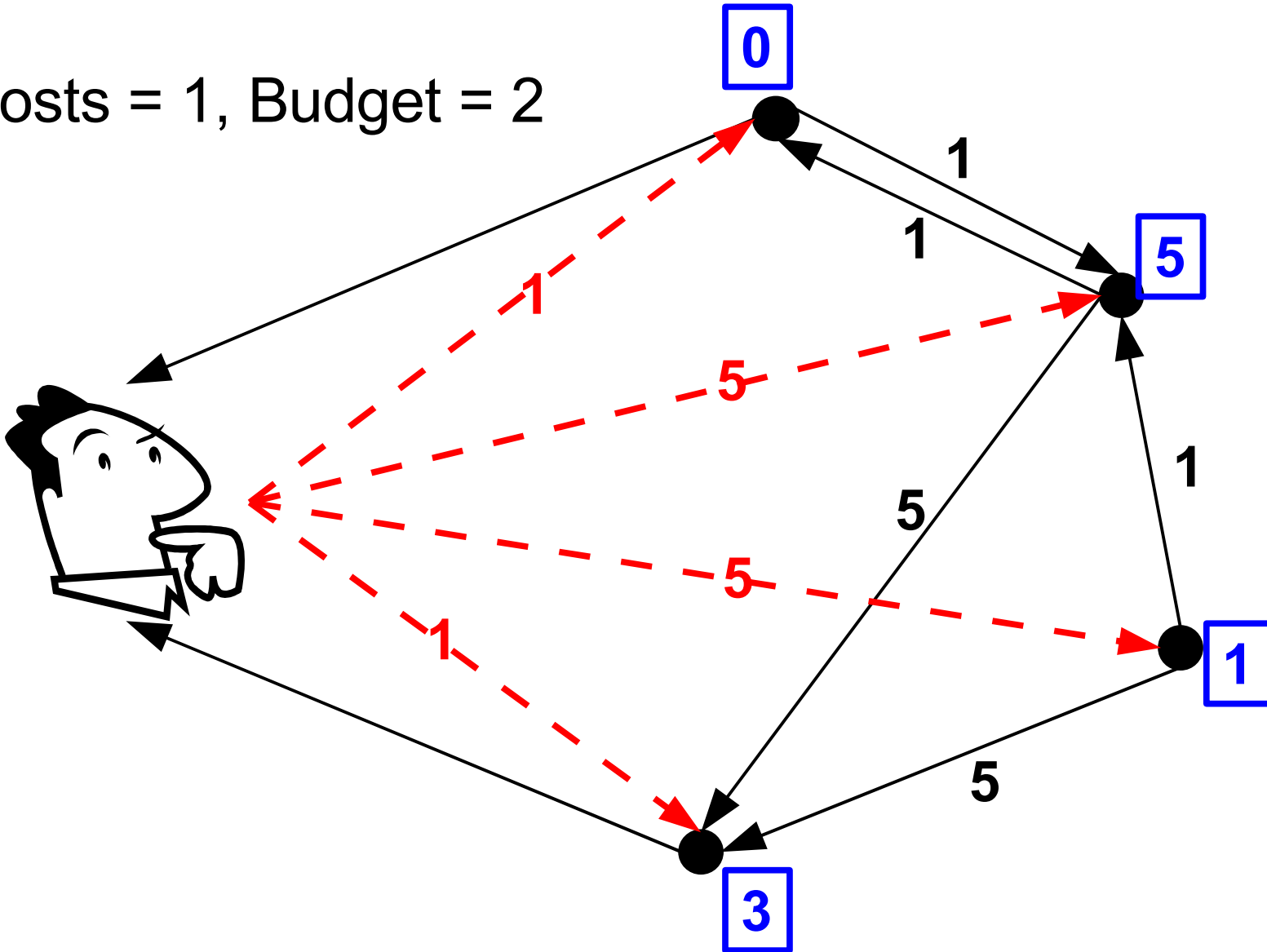
# Example

Costs = 1, Budget = 2



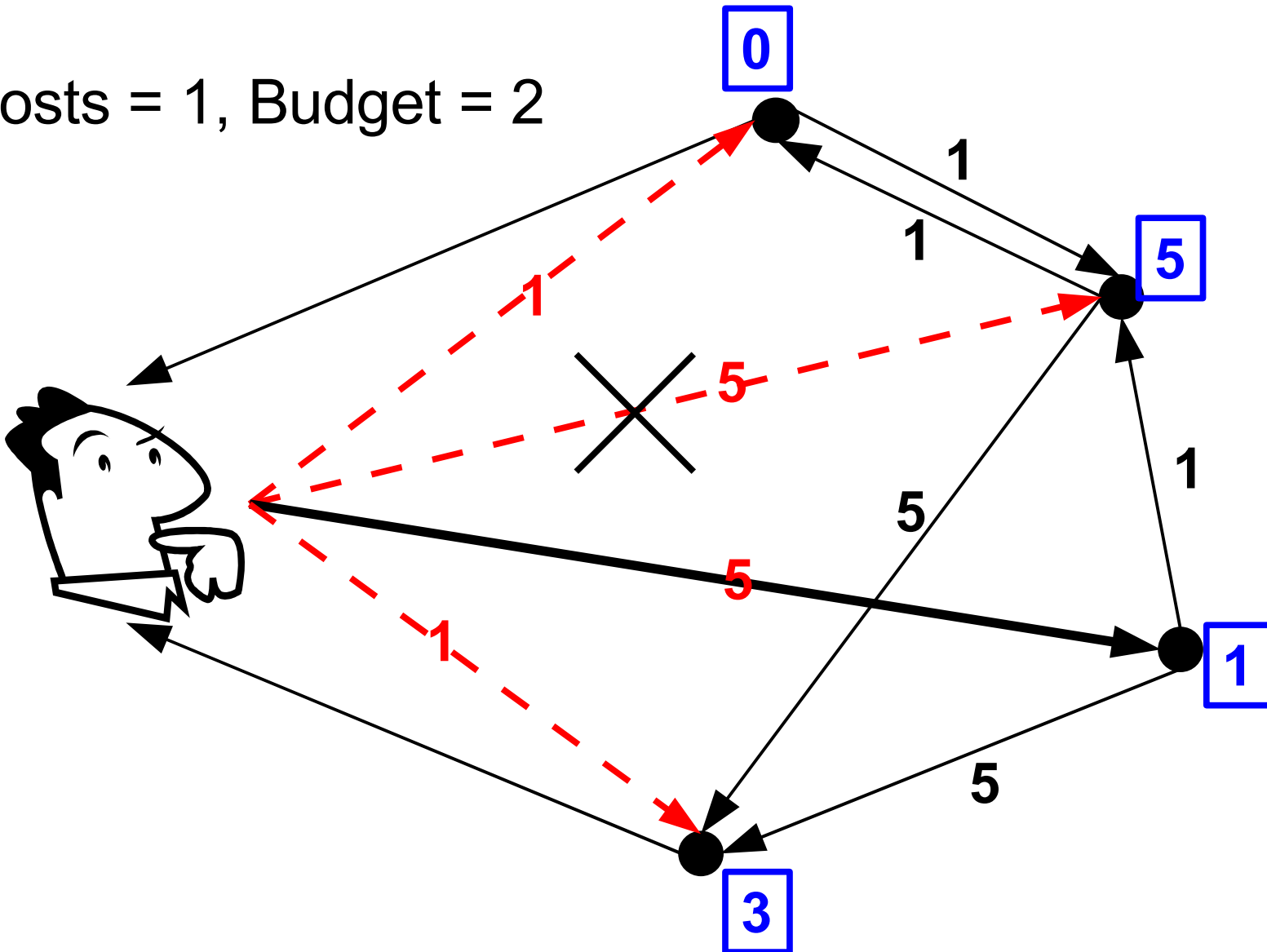
# Example

Costs = 1, Budget = 2



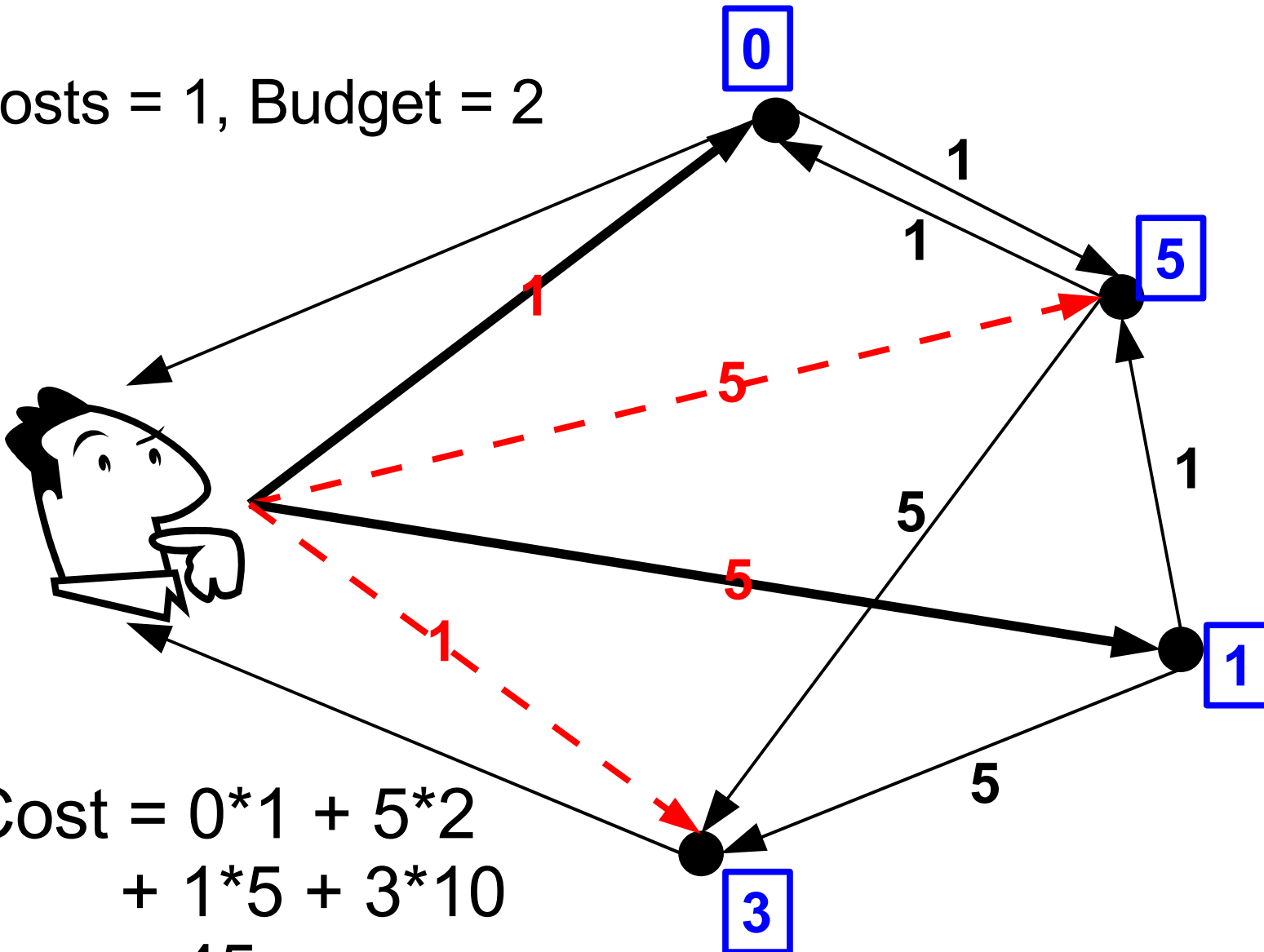
# Example

Costs = 1, Budget = 2



# Example

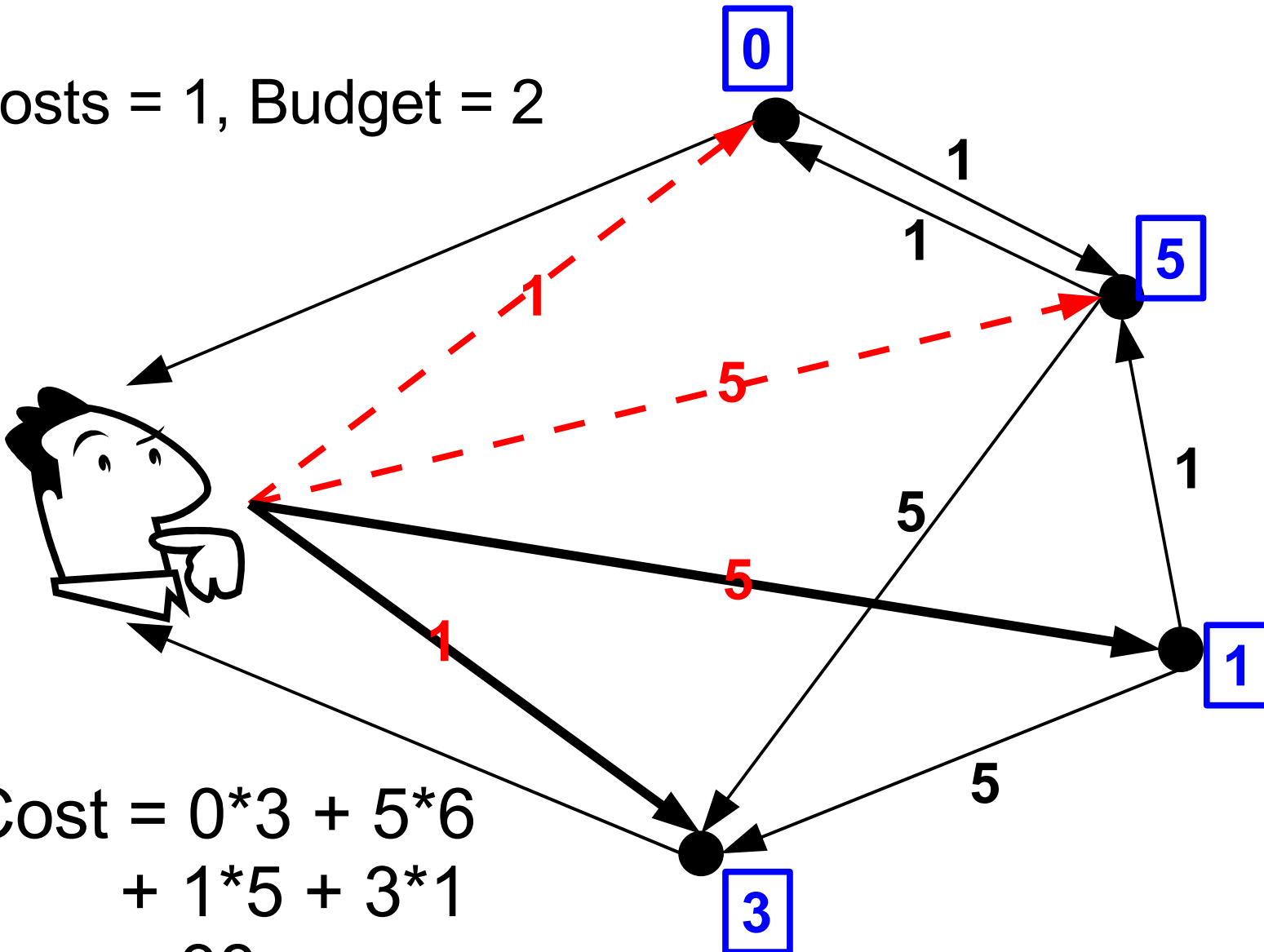
Costs = 1, Budget = 2



$$\begin{aligned} \text{Cost} &= 0 \cdot 1 + 5 \cdot 2 \\ &+ 1 \cdot 5 + 3 \cdot 10 \\ &= 45 \end{aligned}$$

# Example

Costs = 1, Budget = 2



$$\begin{aligned} \text{Cost} &= 0 \cdot 3 + 5 \cdot 6 \\ &+ 1 \cdot 5 + 3 \cdot 1 \\ &= 38 \end{aligned}$$

# Related Work on Network Connection Games

- Cost per edge built into utility instead of a budget built into actions.
  - Fabrikant, Luthra, Maneva, Papadimitriou, and Shenker. On a network creation game. PODC, 2003.
  - Albers, Eilts, Even-Dar, Mansour, and Roditty. On Nash equilibria for a network creation game. SODA, 2006.
  - Demaine, Hajiaghavi, and Mahini. The Price of Anarchy in Network Creation Games. PODC, 2007.
  - Halevi and Mansour. A Network Creation Game with Nonuniform Interests. WINE, 2007.

# Related Work on Network Connection Games

- Experimental results on very similar game.
  - Chun, Fonseca, Stoica, and Kubiatoicz. Characterizing selfishly constructed overlay routing networks. INFOCOM, 2004.
  - Laoutaris, Smaragdakis, Bestavros, John Byers. Implications of selfish neighbor selection in overlay networks. INFOCOM, 2007.

# May be no Nash equilibrium

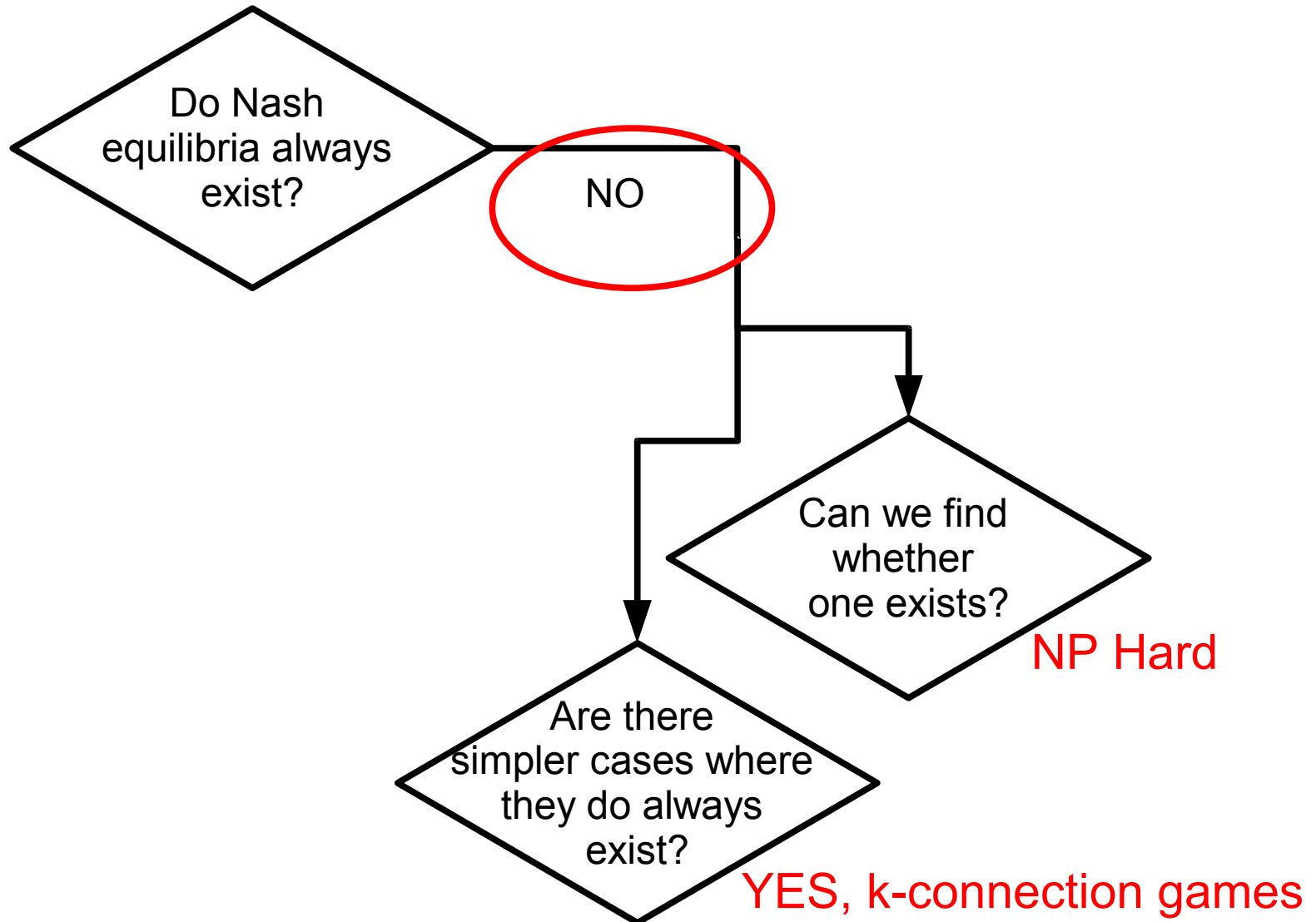
- Number of nodes
- **Affinity for each directed pair of nodes**
- **Link cost for each directed pair of nodes**
- Budget of allowed link cost per node,  $k(v)$
- Length metric from the perspective of each node
- Each node  $v$  spends  $\leq k(v)$  on links to minimize

$$\sum_{\text{other nodes}} (\text{affinity} * \text{shortest path distance})$$

 or disconnection penalty if no path exists.



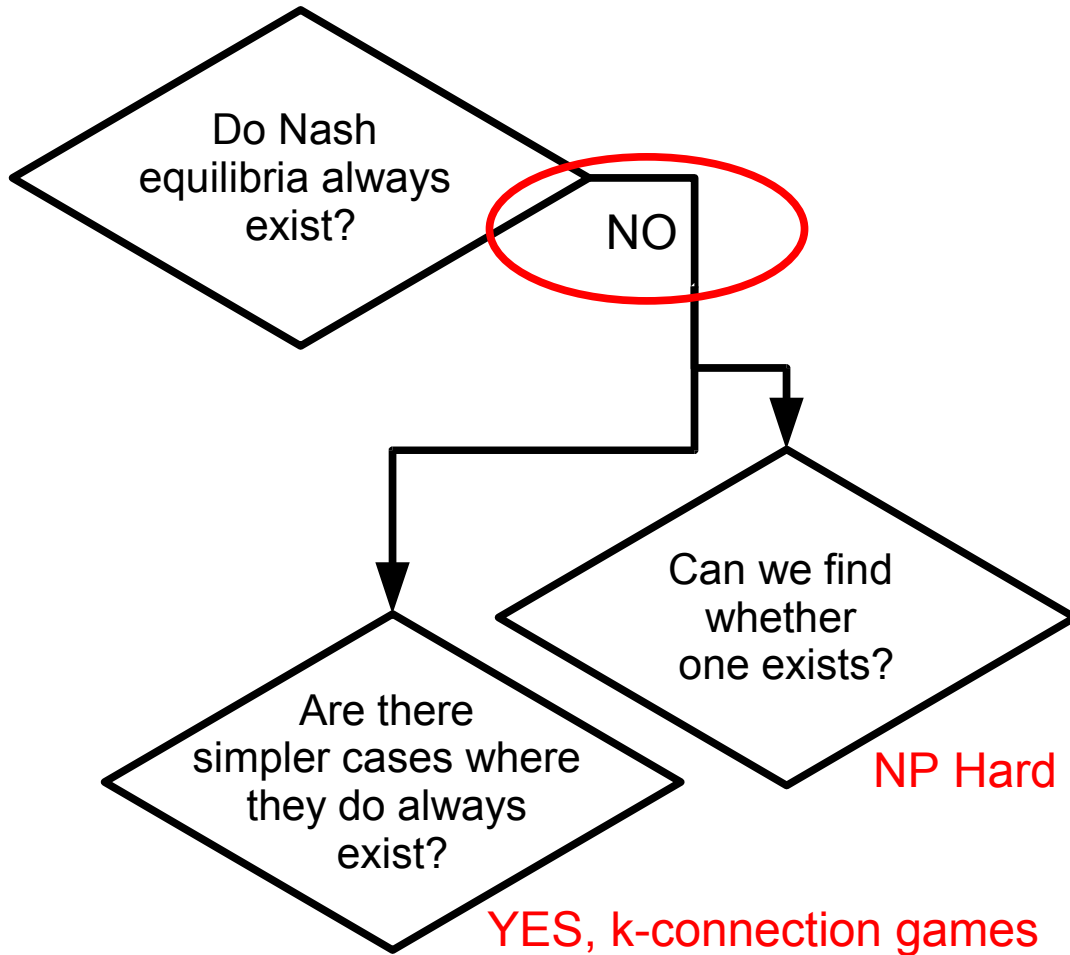
# BBC Games



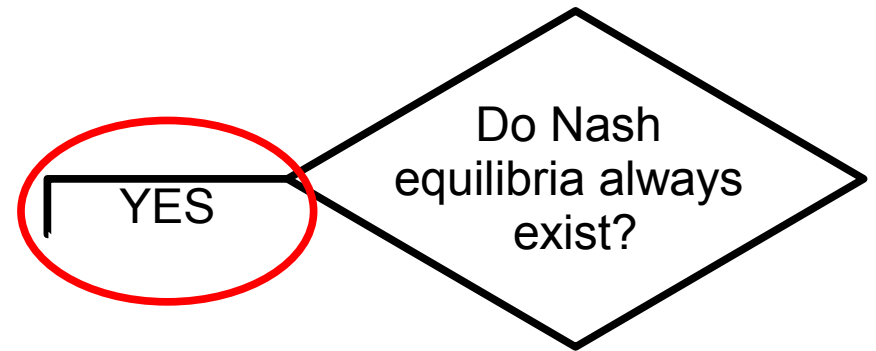
# Open Questions

- Only budgets or lengths are non-uniform
- All nodes have same affinity function

# BBC Games



# Fractional Games



# Fractional BBC Game

- Players = Nodes in the network
- Actions = Connections they can make
  - Budget to spend on edges, cost per edge
  - Fractionally purchase adjacent edges, spending up to the budget
- Costs/Payoffs = How close am I to the other nodes?
  - Affinities for other nodes, lengths for each edge
  - Affinity-weighted average cost of 1-unit minimum cost flow (capacity = purchased amount)

# Fractional BBC Game

- Number of nodes
- Affinity for each directed pair of nodes
- Link cost for each directed pair of nodes
- Budget of allowed link cost per node,  $k(v)$
- Length metric from the perspective of each node
- Each node  $v$  spends  $\leq k(v)$  on links to minimize

$$\sum_{\text{other nodes}} (\text{affinity} * \text{cost of min cost 1 unit flow})$$

↑  
or disconnection penalty if  
no path exists.

# Fractional BBC Game

- Number of nodes
- ~~Affinity for each directed pair of nodes~~ Specified universal destination node
- Link cost for each directed pair of nodes
- Budget of allowed link cost per node,  $k(v)$
- Length metric from the perspective of each node
- Each node  $v$  spends  $\leq k(v)$  on links to minimize

cost of min cost 1 unit flow to destination



or disconnection penalty if no path exists.

# Fractional BBC Game

- Number of nodes
- ~~Affinity for each directed pair of nodes~~ Specified universal destination node
- ~~Link cost for each directed pair of nodes~~ =1
- ~~Budget of allowed link cost per node~~,  $k(v)$  =1
- Length metric from the perspective of each node
- Each node  $v$  spends  $\leq k(v)$  on links to minimize

cost of min cost 1 unit flow to destination



or disconnection penalty if no path exists.

# Fractional BBC Game

- Universal destination node
- Link cost = 1
- Budget = 1
- Length metric from the perspective of each node
- Each node  $v$  spends 1 on links to minimize cost of min cost 1 unit flow to destination

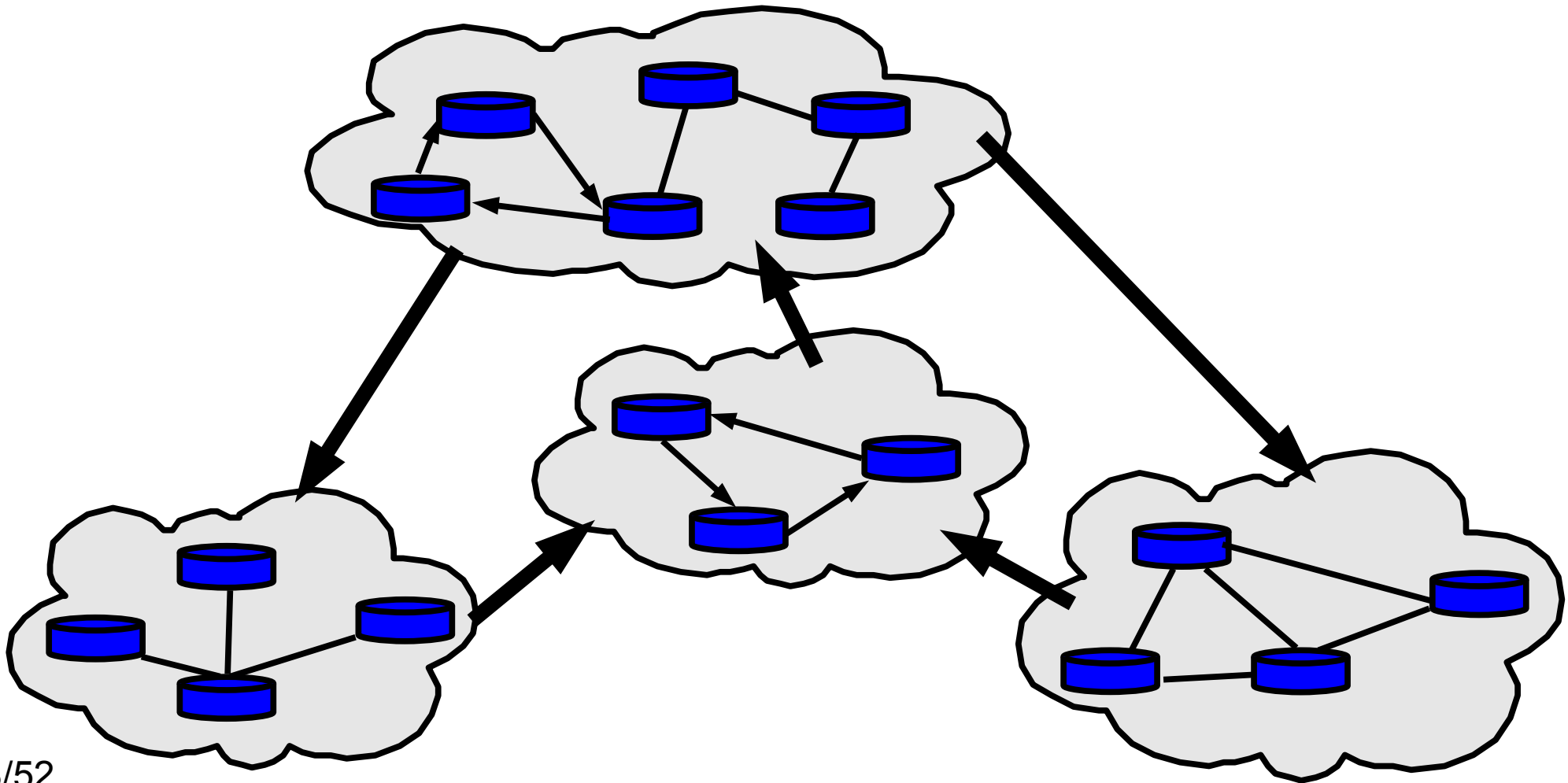
# Fractional BGP Game

- Universal destination node
- Weight 1 to spread across paths
- Preference list across paths to the destination
- Cannot use a path more than the next node along the path
- Best Response: Take as much as possible of highest preference paths.



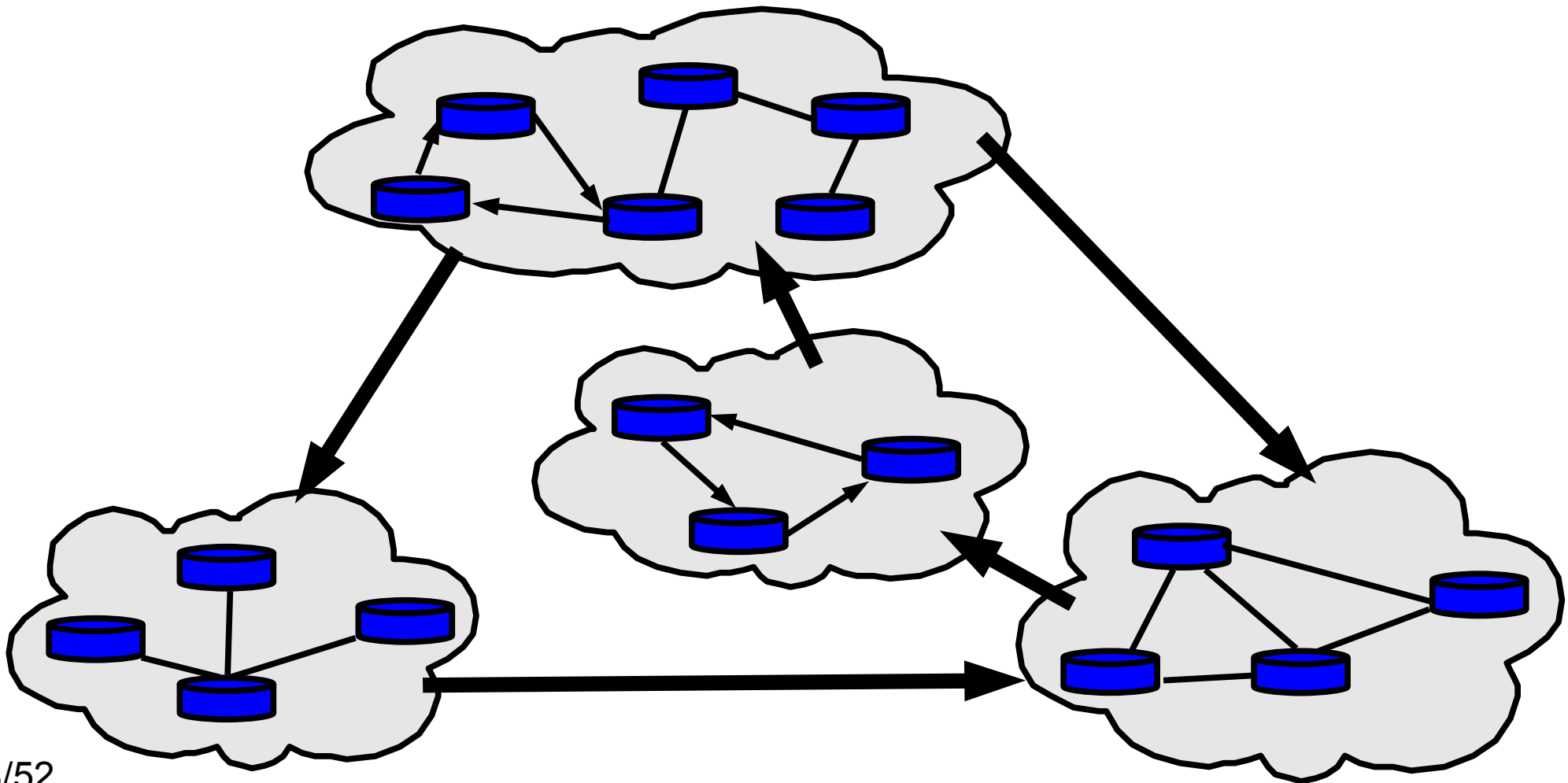
# Border Gateway Protocol

- Rehkter, Li. A Border Gateway Protocol (BGP version 4). RFC 1771, 1995.



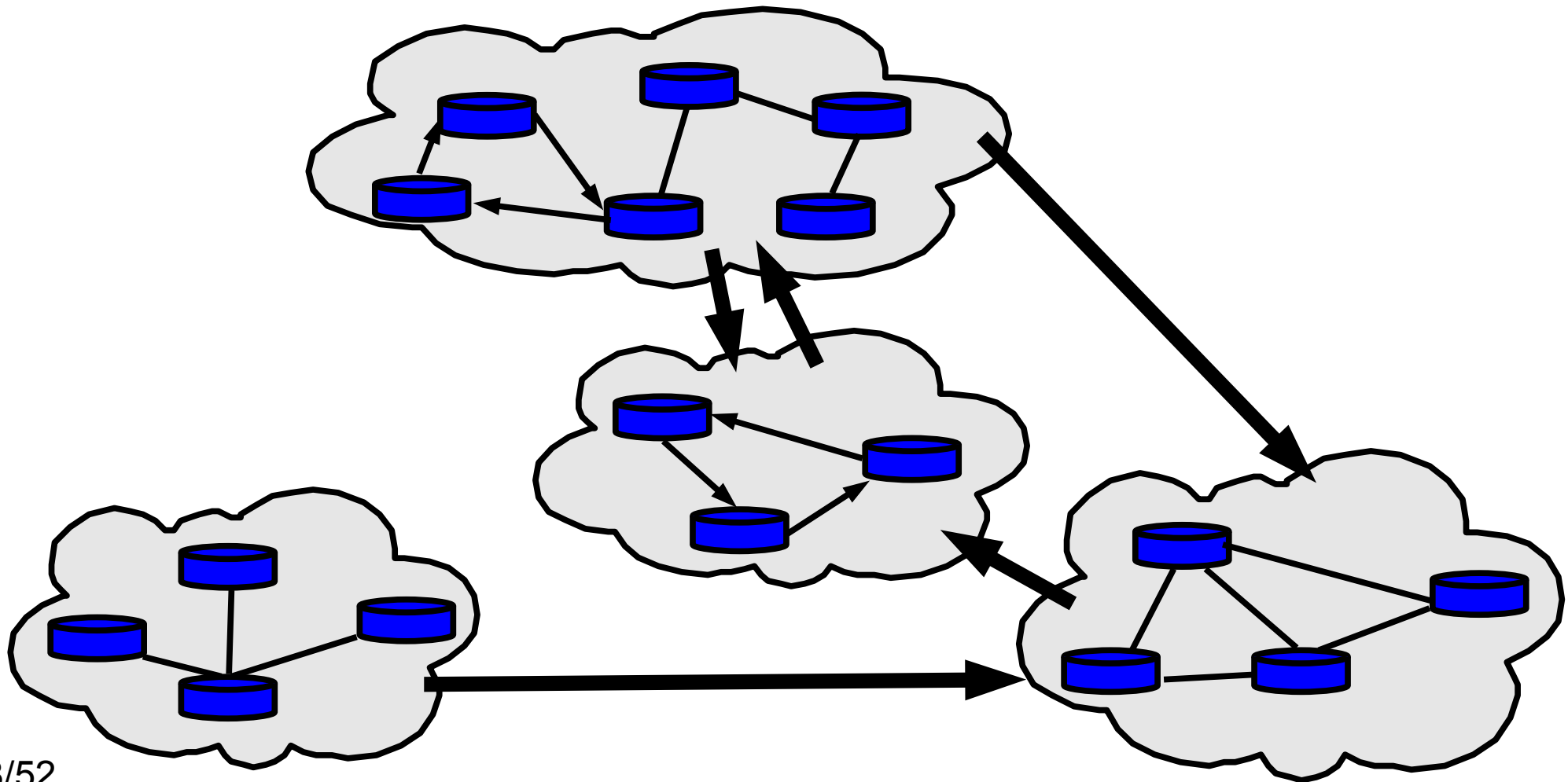
# Border Gateway Protocol

- Varadhan, Govindan, and Estrin. Persistent Route Oscillations in Inter-Domain Routing. Technical Report USC CS TR 96-631, Dept of Computer Science, USC, 1996.



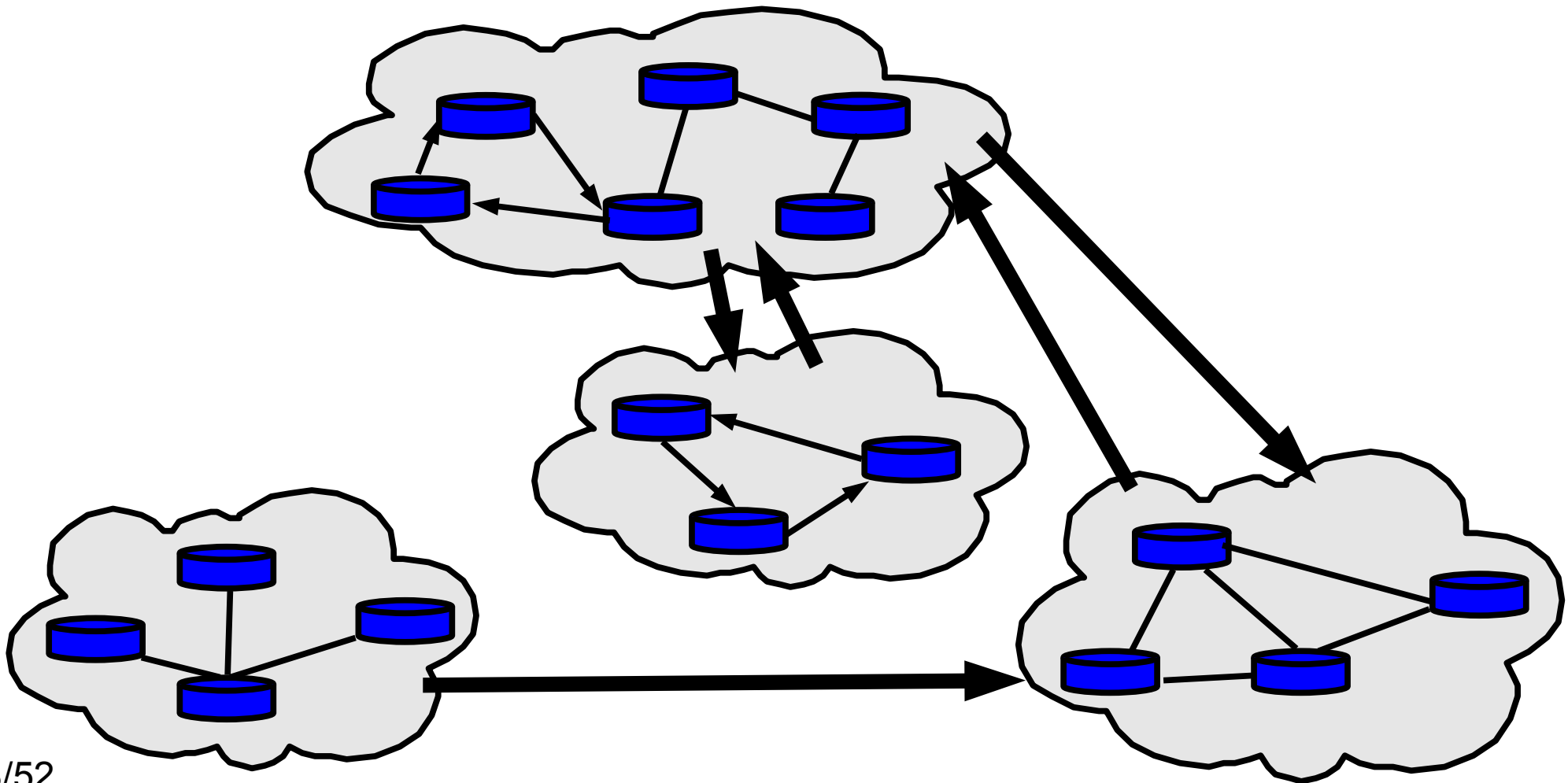
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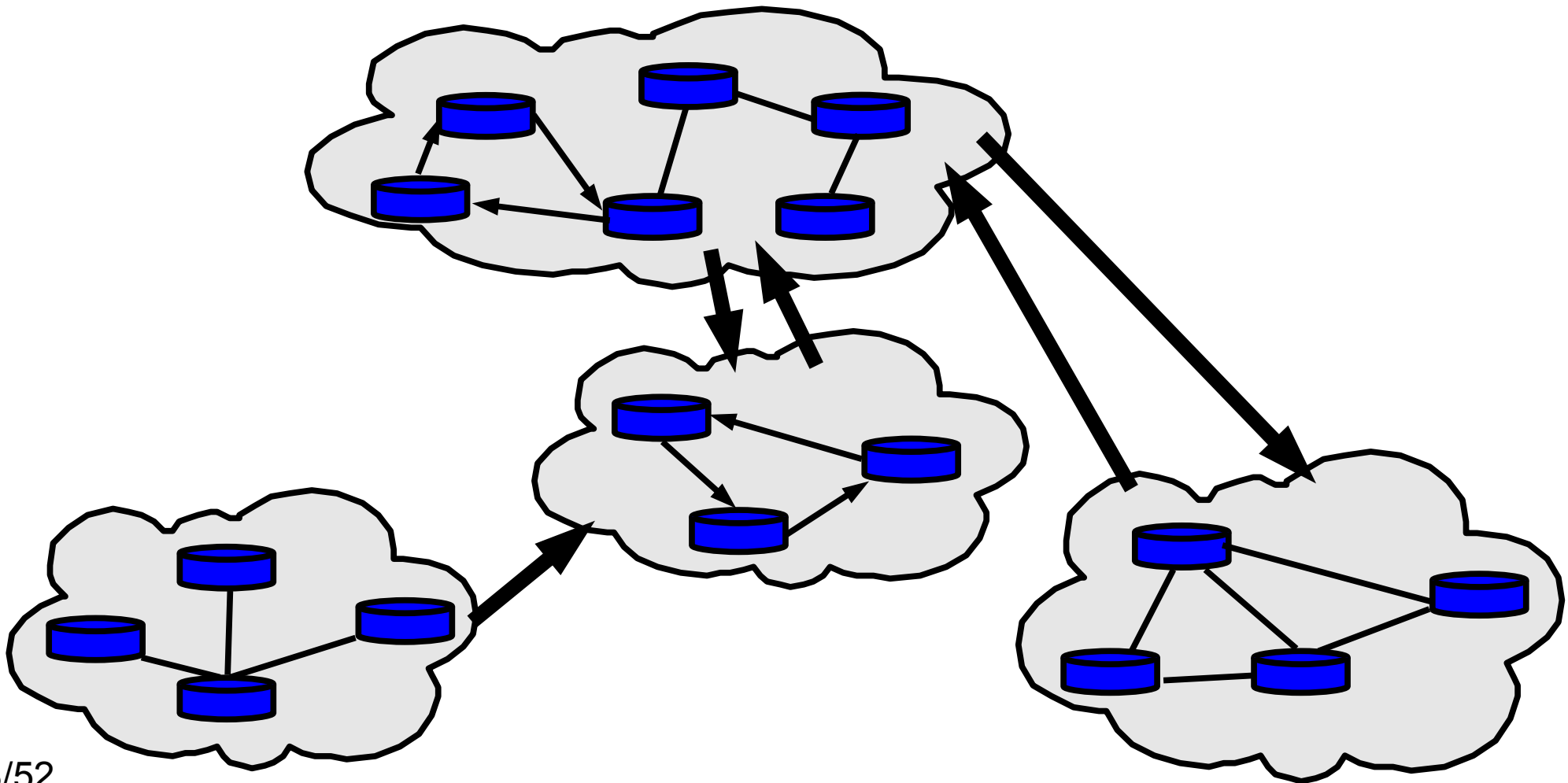
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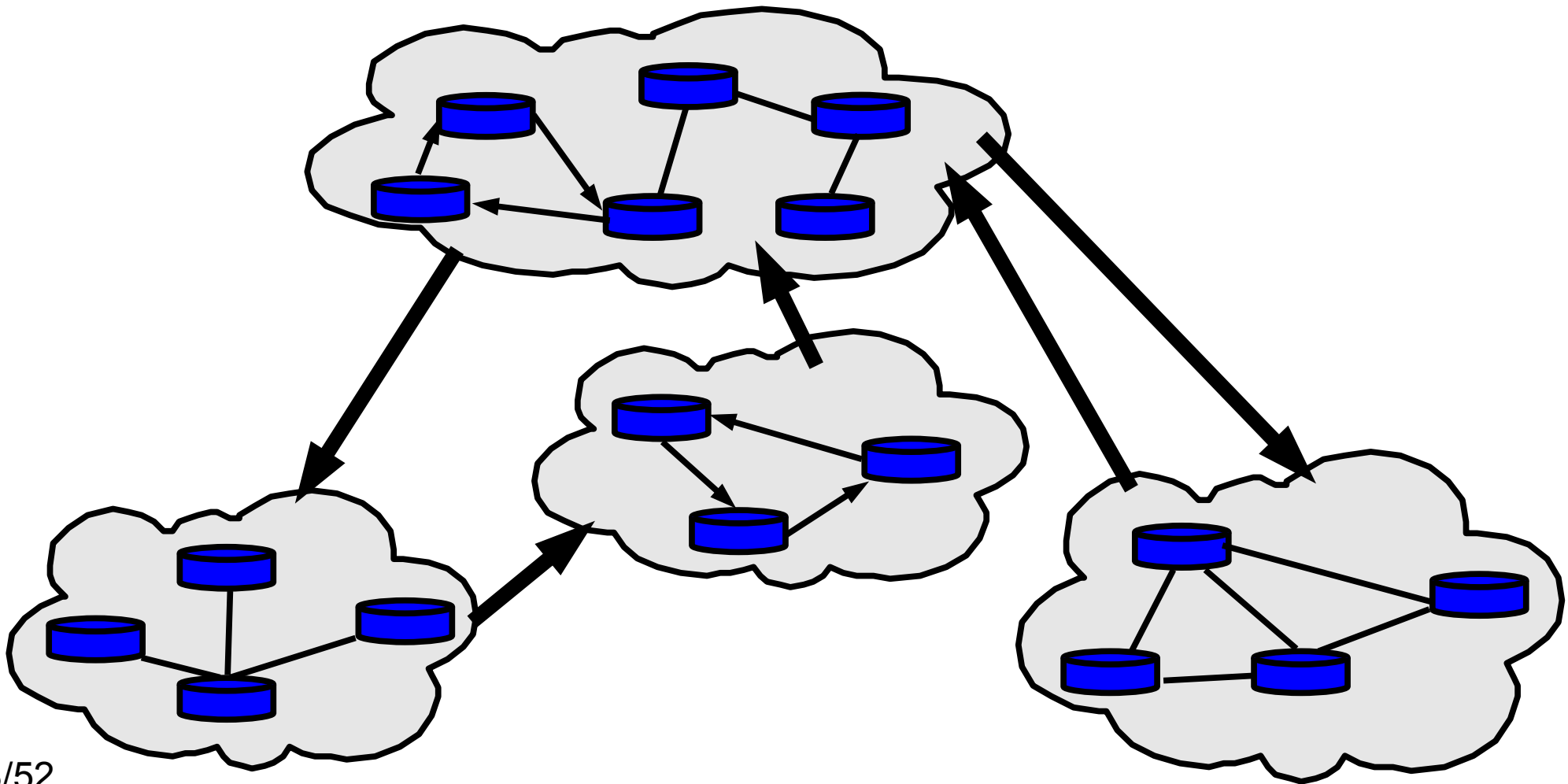
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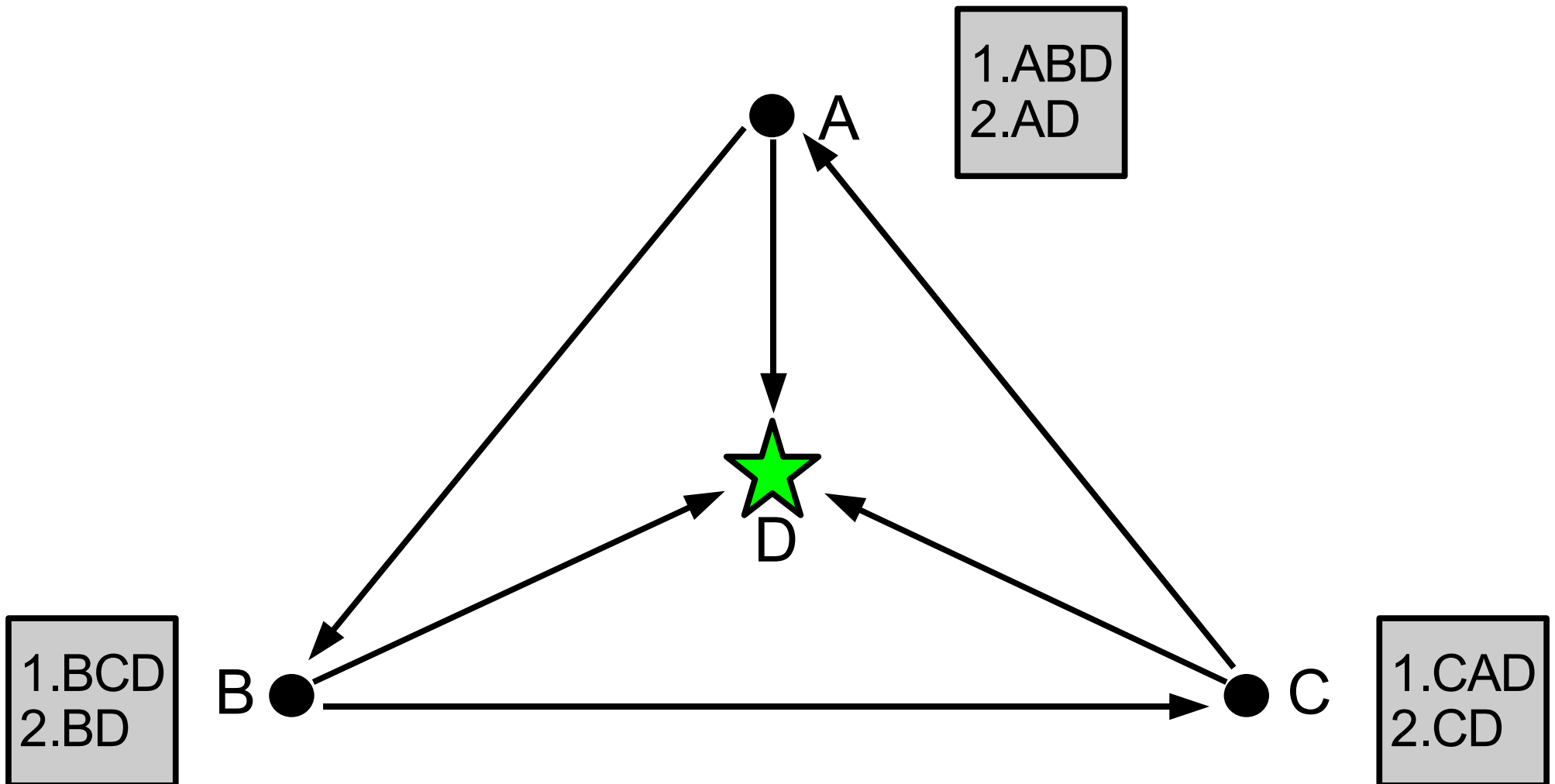
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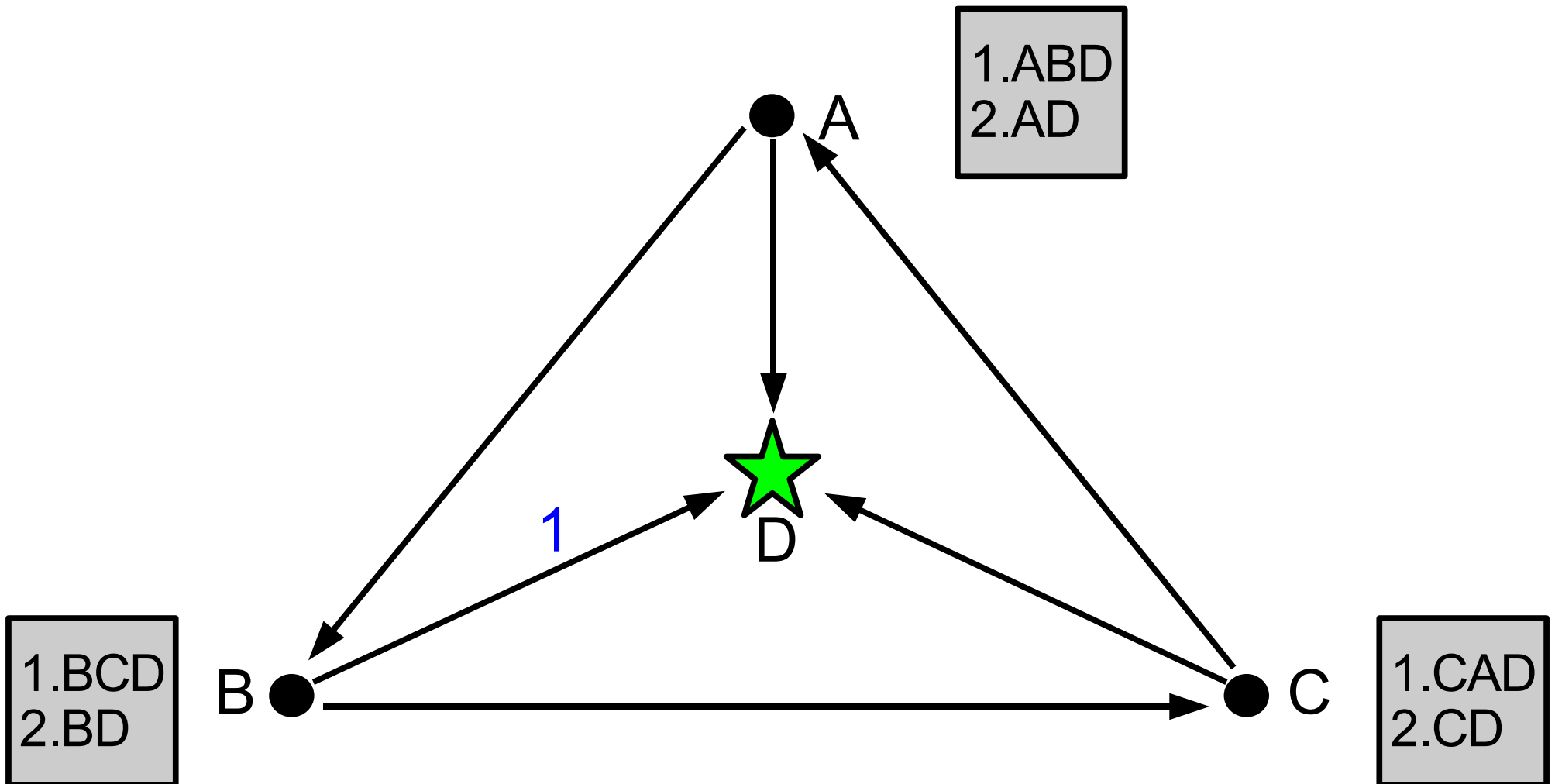
# Stable Paths Problem

- Griffin, Shepherd, and Wilfong. The stable paths problem and interdomain routing. Transactions on Networking, 2002.



# Stable Paths Problem

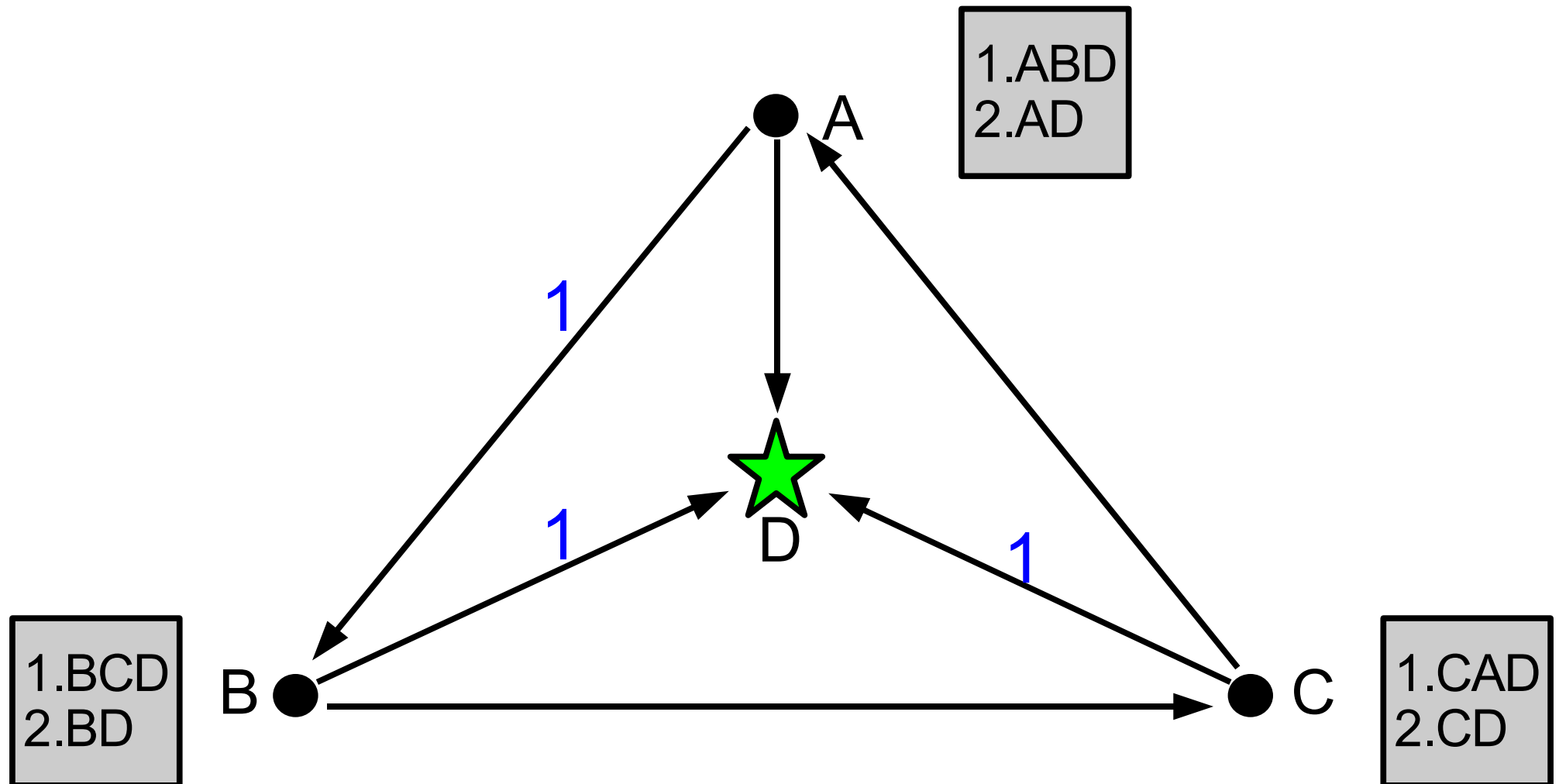
- Griffin, Shepherd, and Wilfong. The stable paths problem and interdomain routing. Transactions on Networking, 2002.





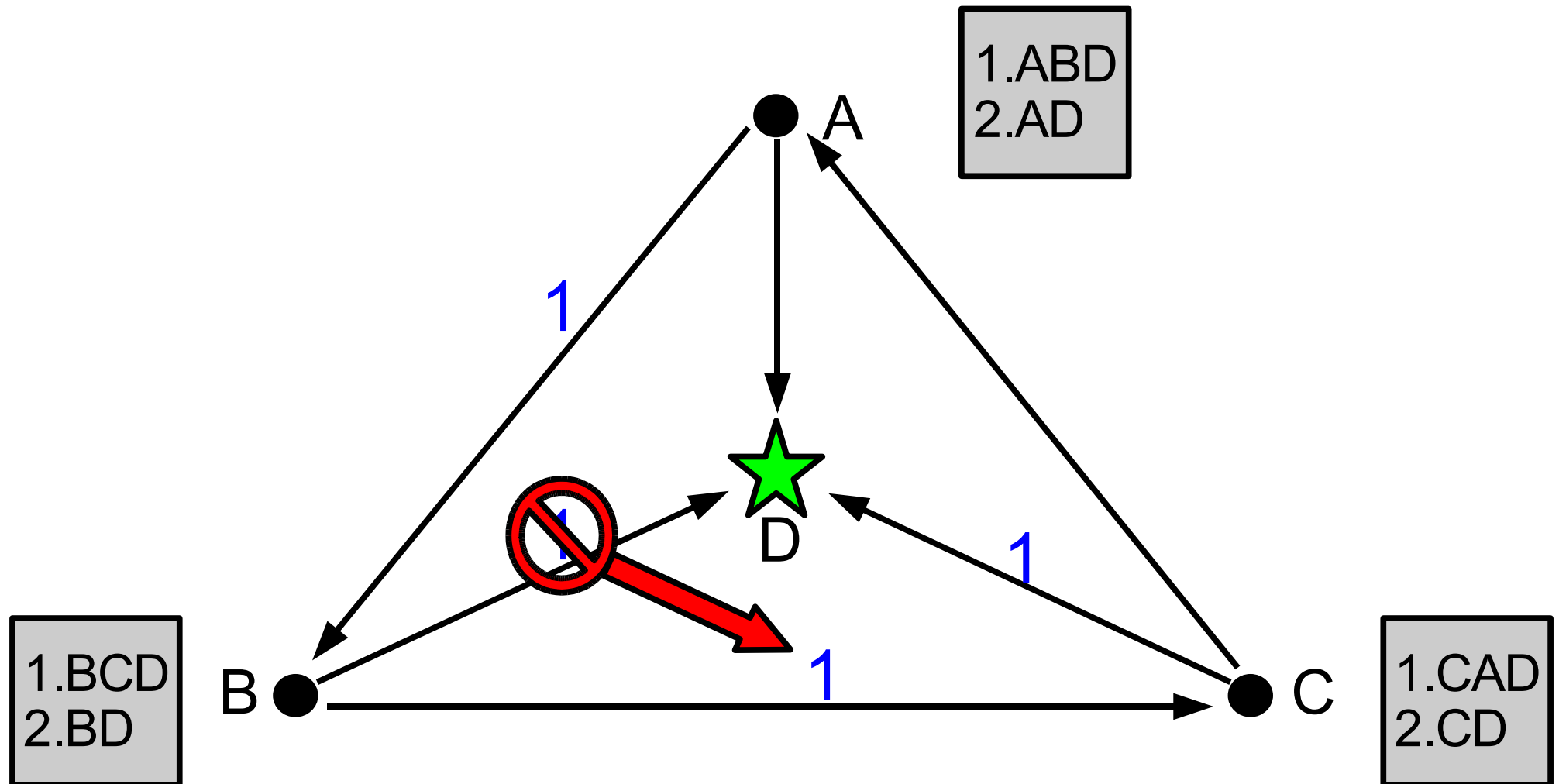
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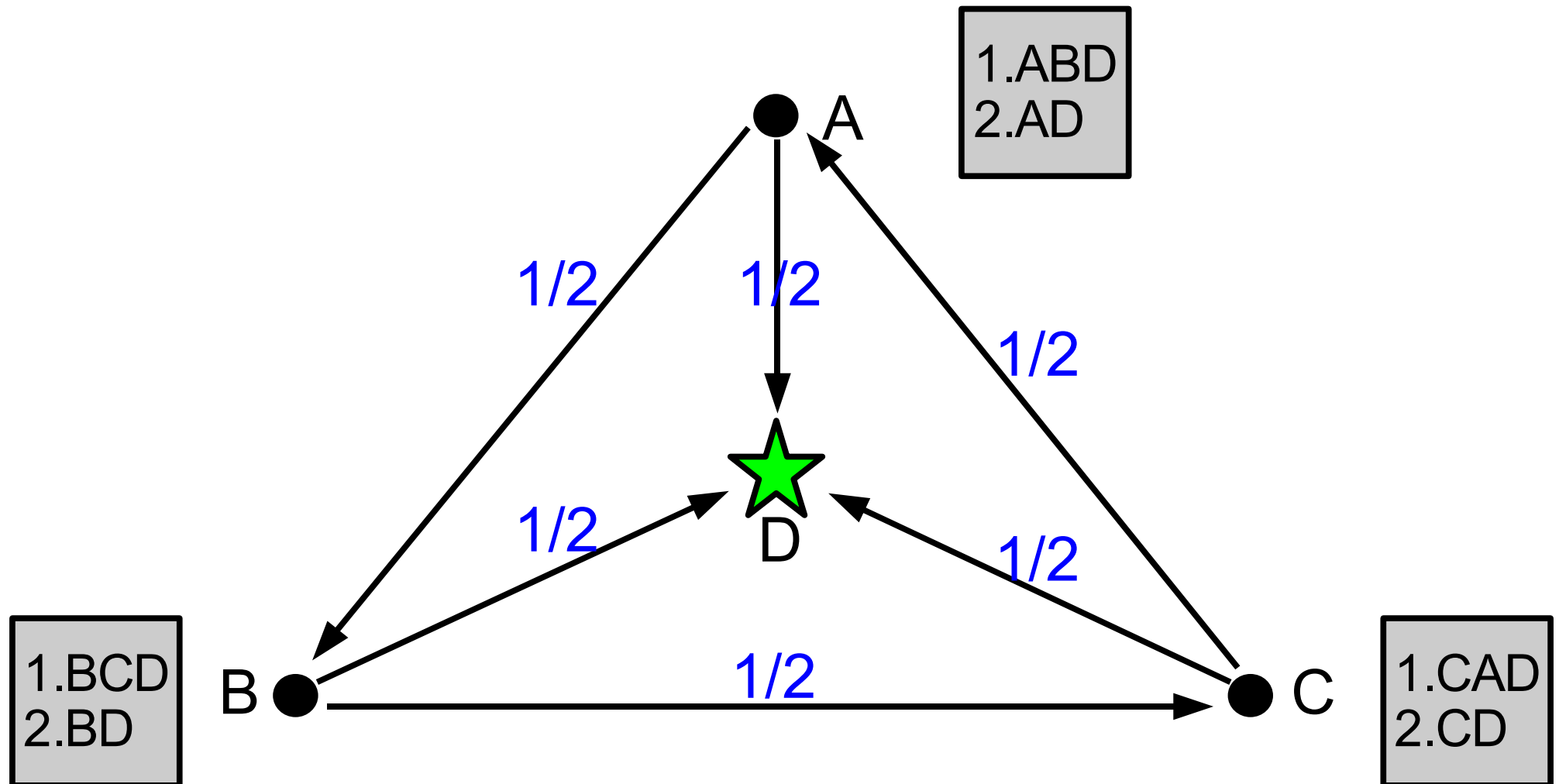
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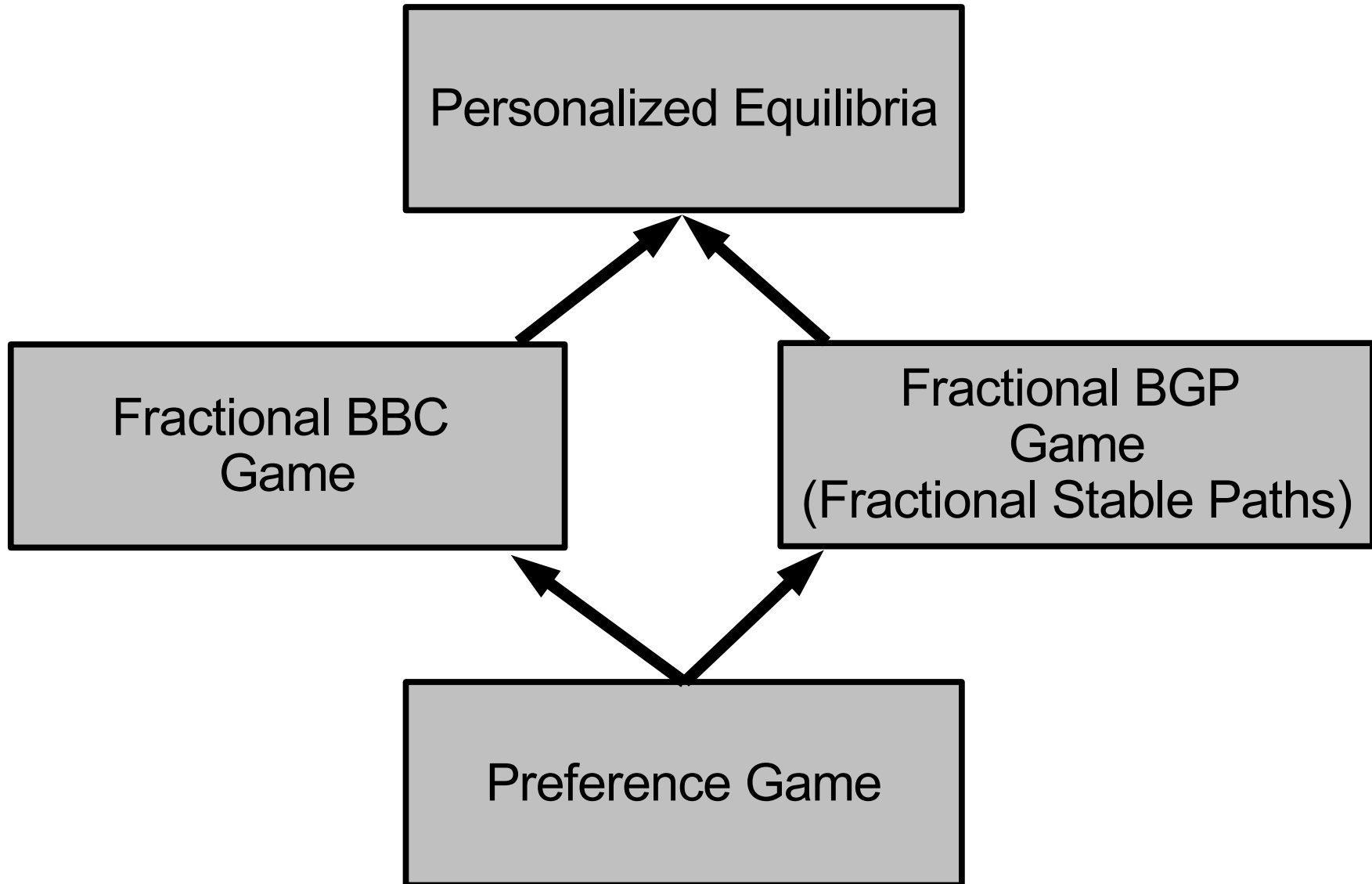


# Fractional Stable Paths Problem

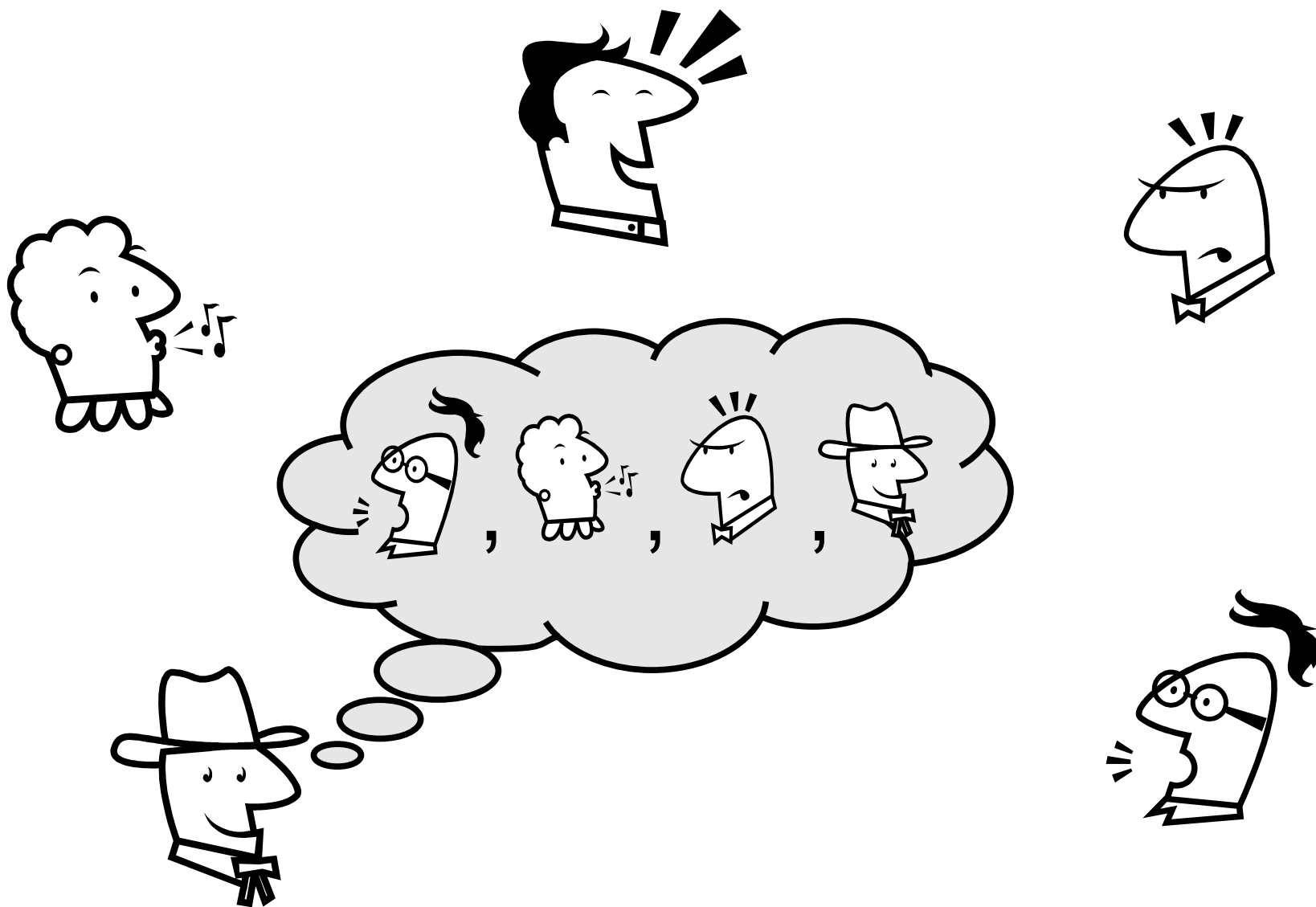
- Haxell and Wilfong. A fractional model of the border gateway protocol (BGP). SODA, 2008.






# Fractional Games





# The Preference Game





# The Preference Game

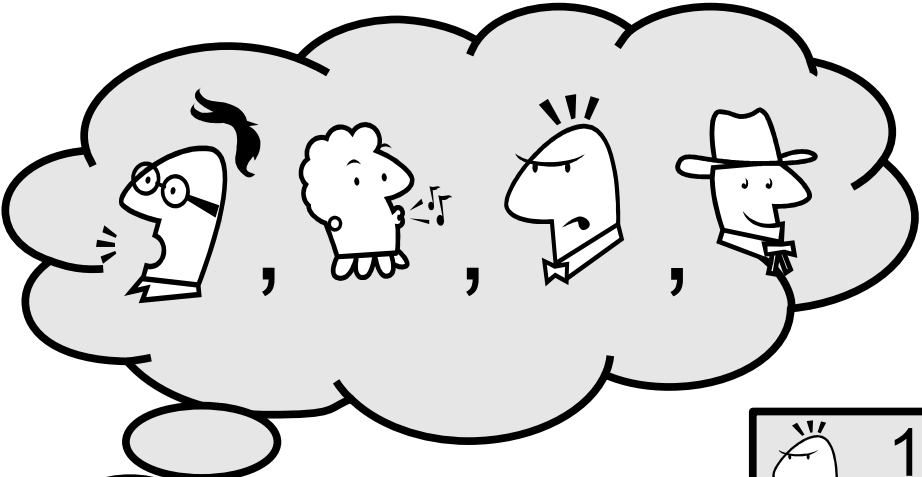
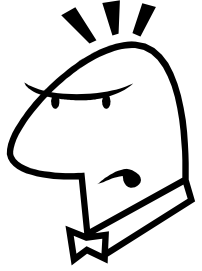
	1/2
	1/6
	1/3






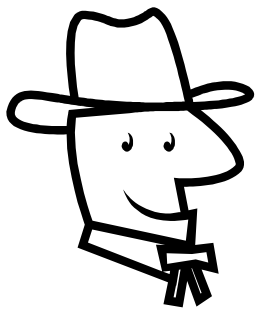
	1/6
	5/6






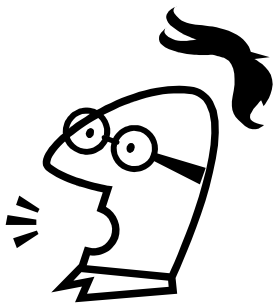
	5/6
	1/6



	1/3
	1/6
	1/2



	1/6
	1/2
	1/3



# The Preference Game

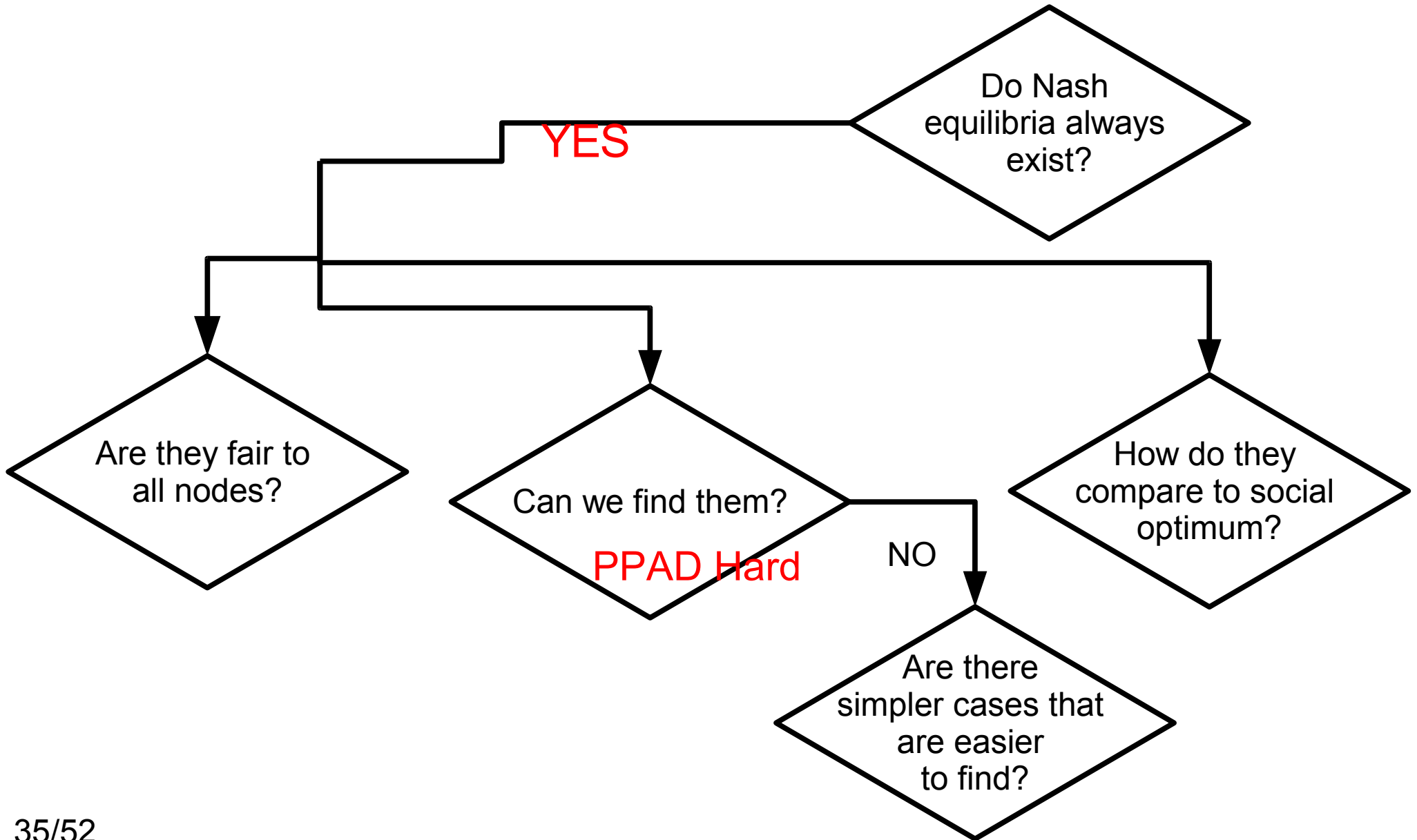
- Reduces to both fractional BBC and fractional BGP games.
- A pure Nash equilibrium always exists.
- In fact, a *rational* pure Nash equilibrium always exists.
- Seems like it should be easy to “solve”
- If preferences follow some rules, it is easy to solve.

# The Preference Game

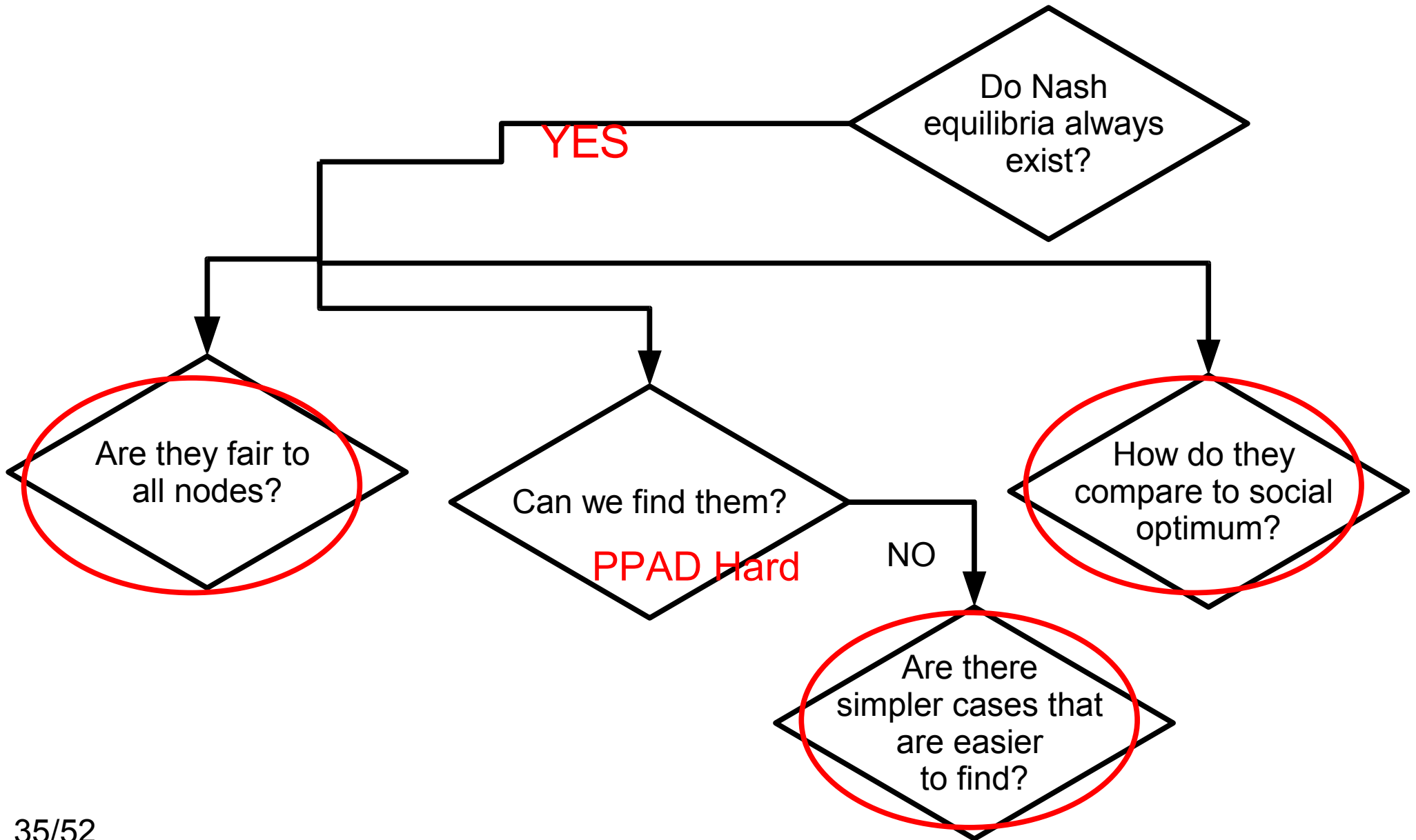
- In general: PPAD hard to find an equilibrium (even an approximate equilibrium)
  - PPAD = Same as “end of the line”
    - Papadimitriou. On the Complexity of the Parity Argument and Other Inefficient Proofs of Existence. JCSS 48(3), 1994.
  - As hard as finding mixed Nash in general games
    - Daskalakis, Goldberg, Papadimitriou. The Complexity of Computing a Nash Equilibrium In STOC, 2006.
    - Goldberg, Papadimitriou. Reducibility Among Equilibrium Problems. STOC, 2006.
    - Chen, Deng, and Teng. Computing Nash Equilibria: Approximation and Smoothed Complexity. FOCS, 2006.



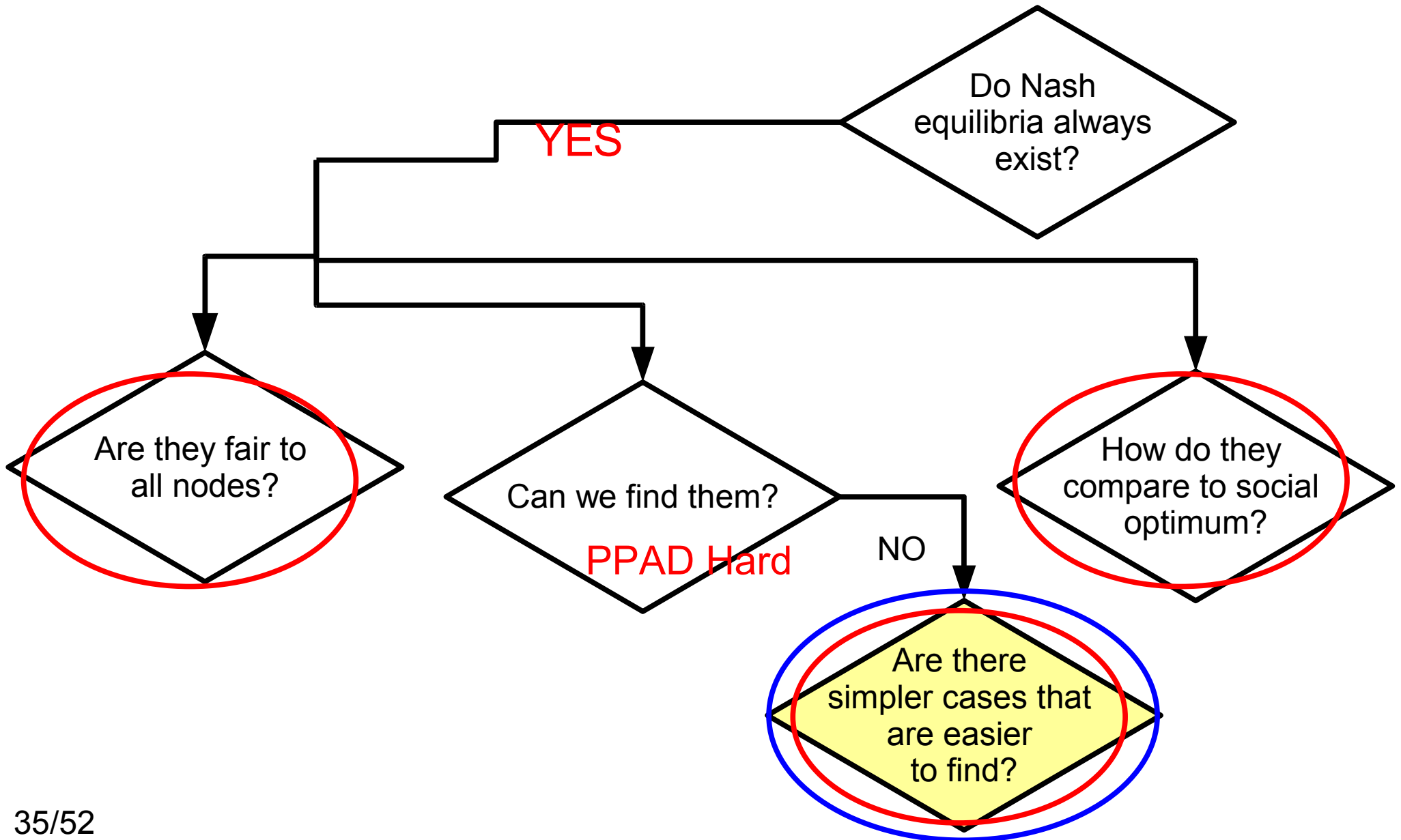
# Fractional Games



# Open questions on fractional games




# Open questions on fractional games



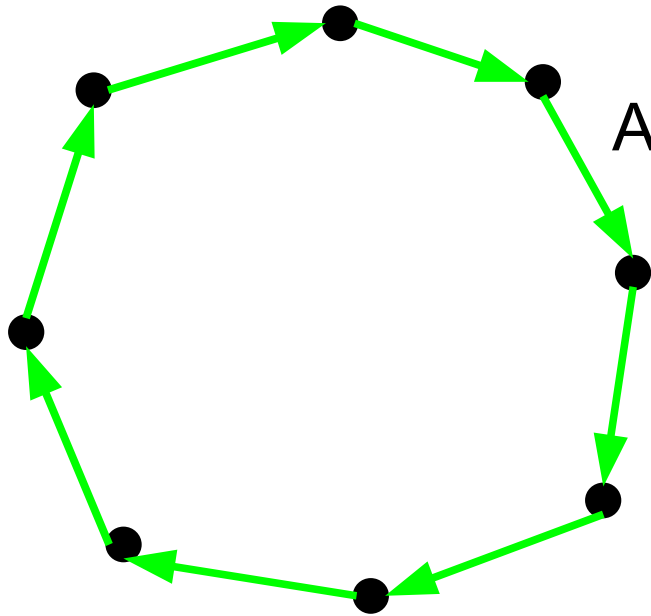
# Fractional BBC Games, $k=1$

- Number of nodes =  $n$
- Affinity for each directed pair of nodes =  $1$
- Link cost for each directed pair of nodes =  $1$
- Budget of allowed link cost per node,  $k(v) = 1$
- Length metric =  $[1]$
- Each node  $v$  spends  $\leq k(v)$  on links to minimize

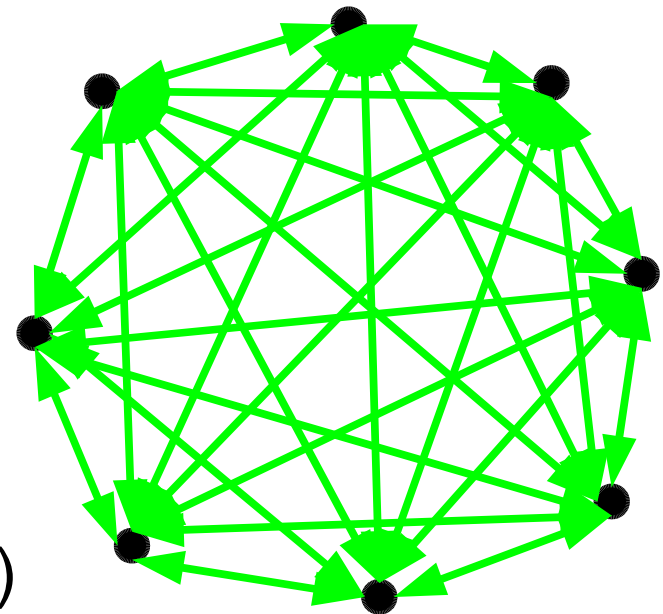
$\sum_{\text{other nodes}} (\text{cost of min cost 1 unit flow})$

 or disconnection penalty if no path exists.

# Fractional BBC Games, $k=1$



Each edge weight = 1  
Average distance per node =  $(n-1) / 2$



Each edge weight =  $1/(n-1)$   
Average distance per node =  $2 - 1/(n-1)$

# Fractional BBC, $k=1$

- If each node can get 1 unit of flow to each other, it is an equilibrium.
- Is this condition necessary?

# Characterizing Fractional Games

Mixed Nash for the integral version:

- If you play an action  $1/3$ , you must play this  $1/3$  of the time against each set of opponents' actions.
- If two opponents play actions  $1/4$  each, you may only play  $1/16$  against that combination.

Pure Nash in the fractional version:

- If you play an action  $1/3$ , you may use this with any legal  $1/3$  of the opponents' actions.
- If two opponents play actions  $1/4$  each, you may play  $1/4$  against this combination.

# Personalized Equilibrium

Mixed Nash for the integral version:

- If you play an action  $1/3$ , you must play this  $1/3$  of the time against each set of opponents' actions.
- If two opponents play actions  $1/4$  each, you may only play  $1/16$  against that combination.

Pure Nash in the fractional version:

- If you play an action  $1/3$ , you may use this with any legal  $1/3$  of the opponents' actions.
- If two opponents play actions  $1/4$  each, you may play  $1/4$  against this combination.

same rules in general matrix games.



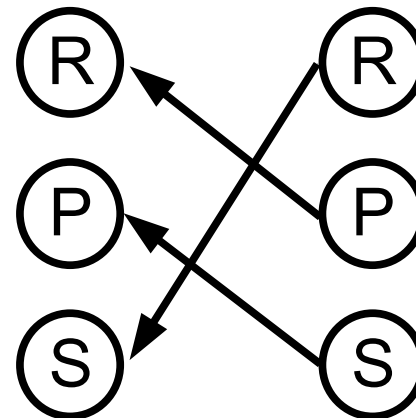
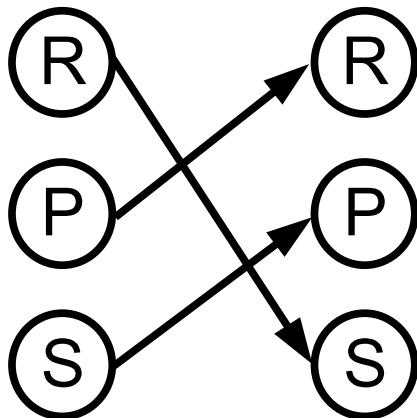
# Personalized Equilibrium

	R	P	S
R	0 / 0	-1 / 1	1 / -1
P	1 / -1	0 / 0	-1 / 1
S	-1 / 1	1 / -1	0 / 0

Mixed Nash: 1/3 on each

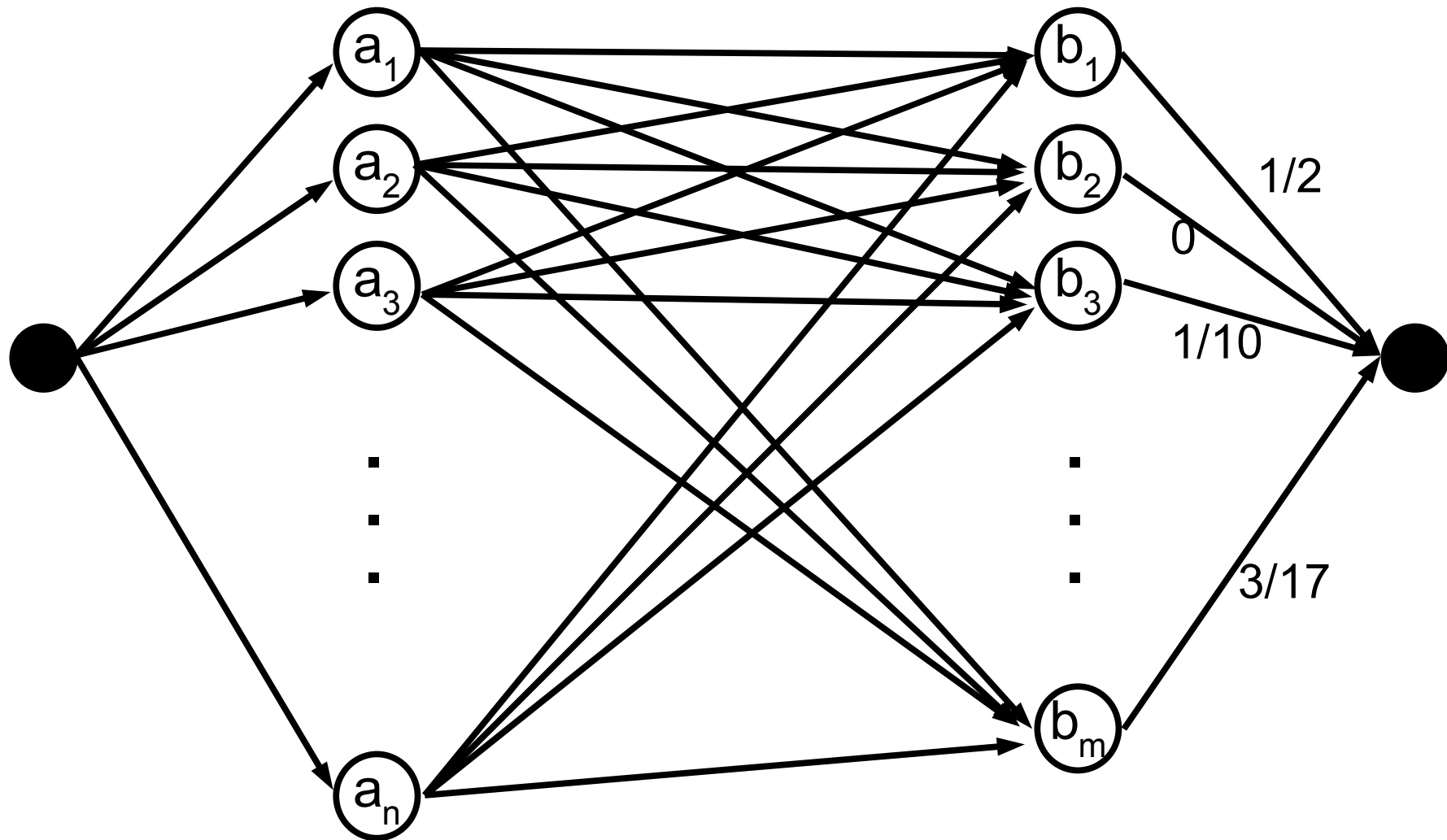
$$\begin{aligned}
 \text{Payoff} &= 1/3 * ((1/3)*0 + (1/3)*-1 + (1/3)*1) \\
 &+ 1/3 * ((1/3)*1 + (1/3)*0 + (1/3)*-1) \\
 &+ 1/3 * ((1/3)*-1 + (1/3)*1 + (1/3)*0) \\
 &= 0
 \end{aligned}$$

Personalized, 1/3 each –  
can match up actions to best personal advantage

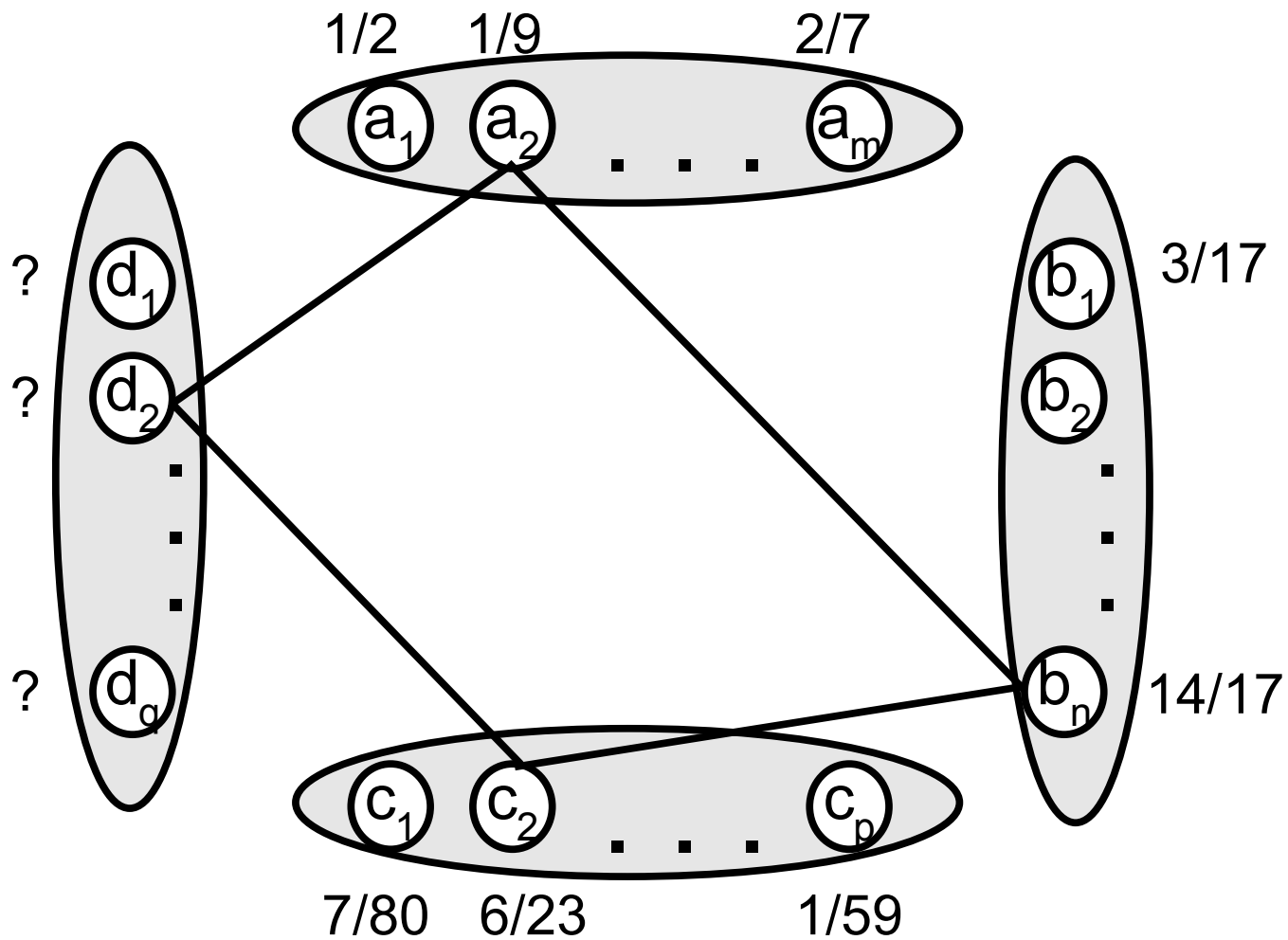


$$\text{Payoff} = (1/3)*1 + (1/3)*1 + (1/3)*1 = 1$$

# Personalized Equilibrium



# Personalized Equilibrium



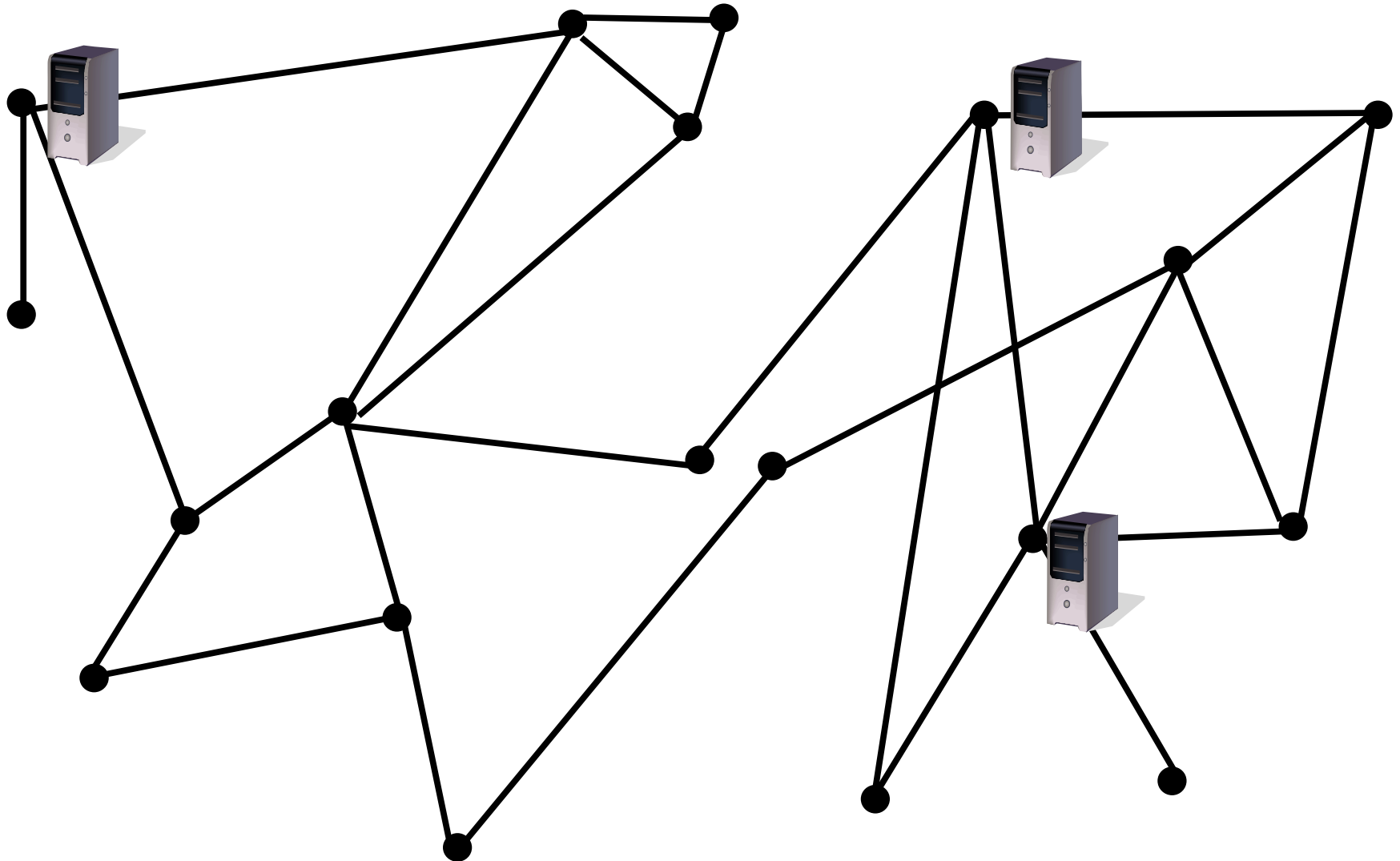
# Personalized Equilibrium

- Rational Equilibrium always exists (solution to union of many linear programs)
- 2-player: fully characterized (can be represented by linear program)
- 3-player: ???
- 4-player: PPAD hard to compute
- 5+-player: PPAD hard to approximate

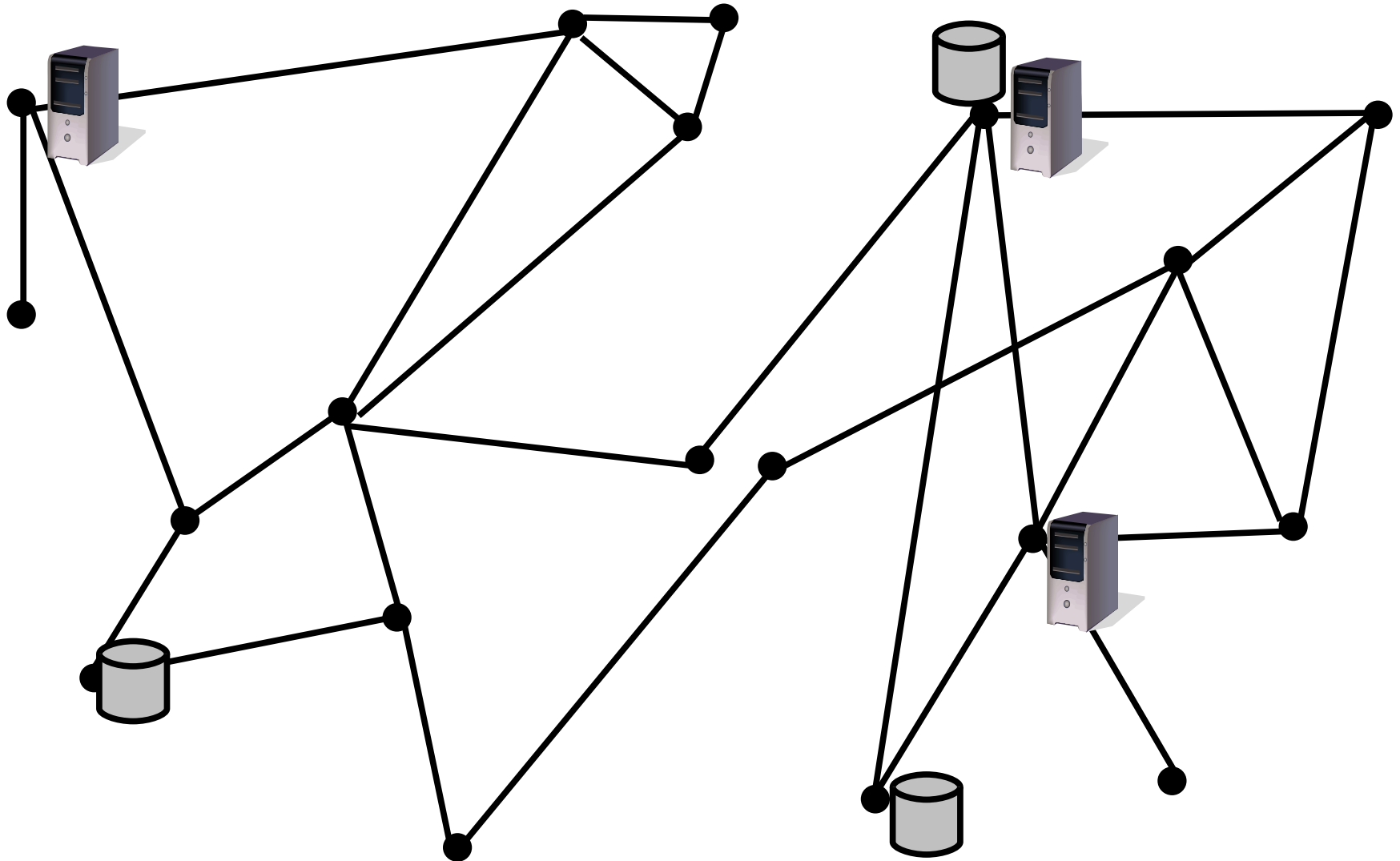
# Segue Slide

- Games between overlay network nodes
  - BBC Games
  - Fractional BBC Games
  - Fractional BGP Games
- Characterizing Fractional Games
  - Preference Games
  - Personalized Equilibria
- Interaction Between Decentrally Designed Network and Centralized Algorithm

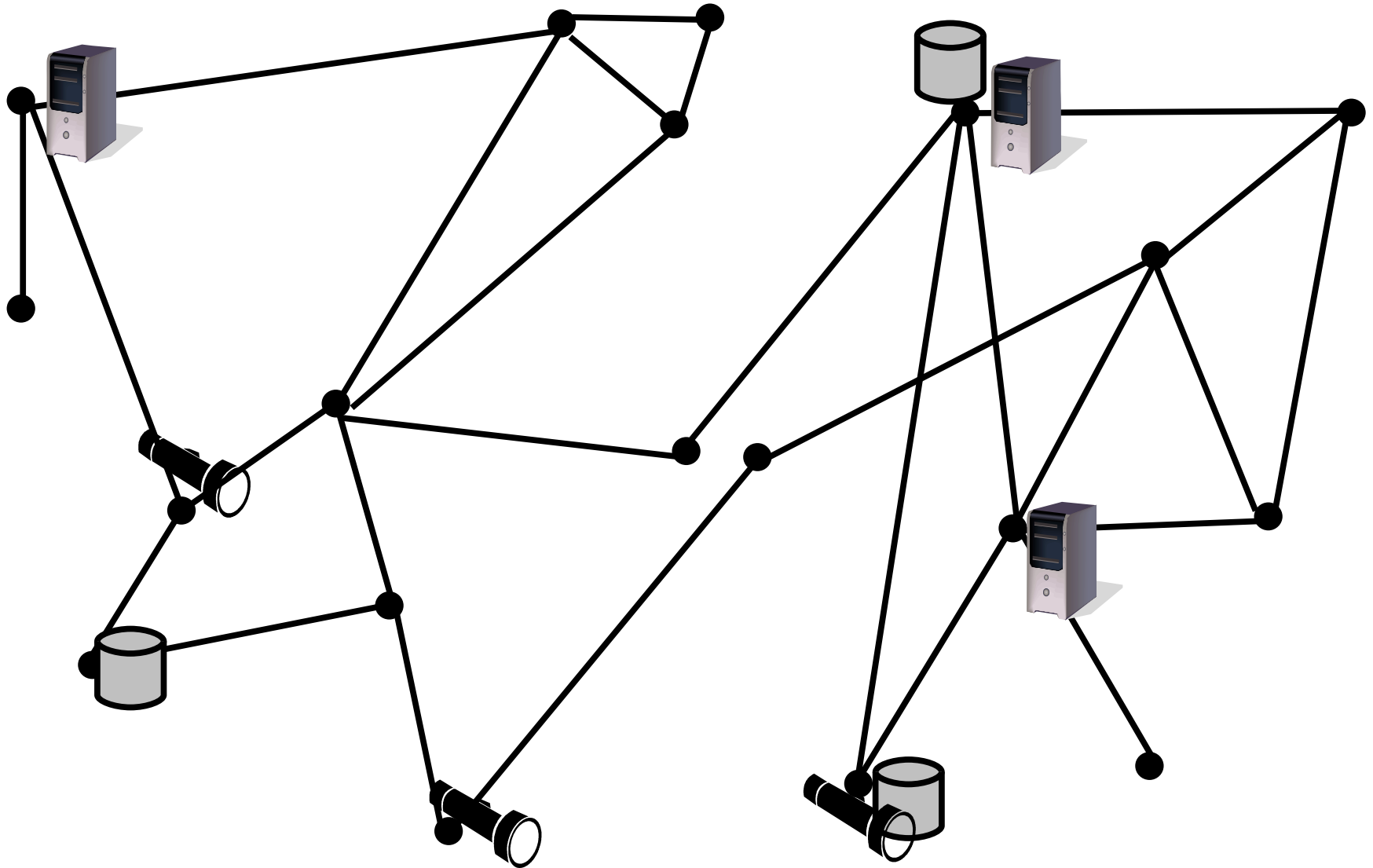
# Centralized Algorithm



# Centralized Algorithm

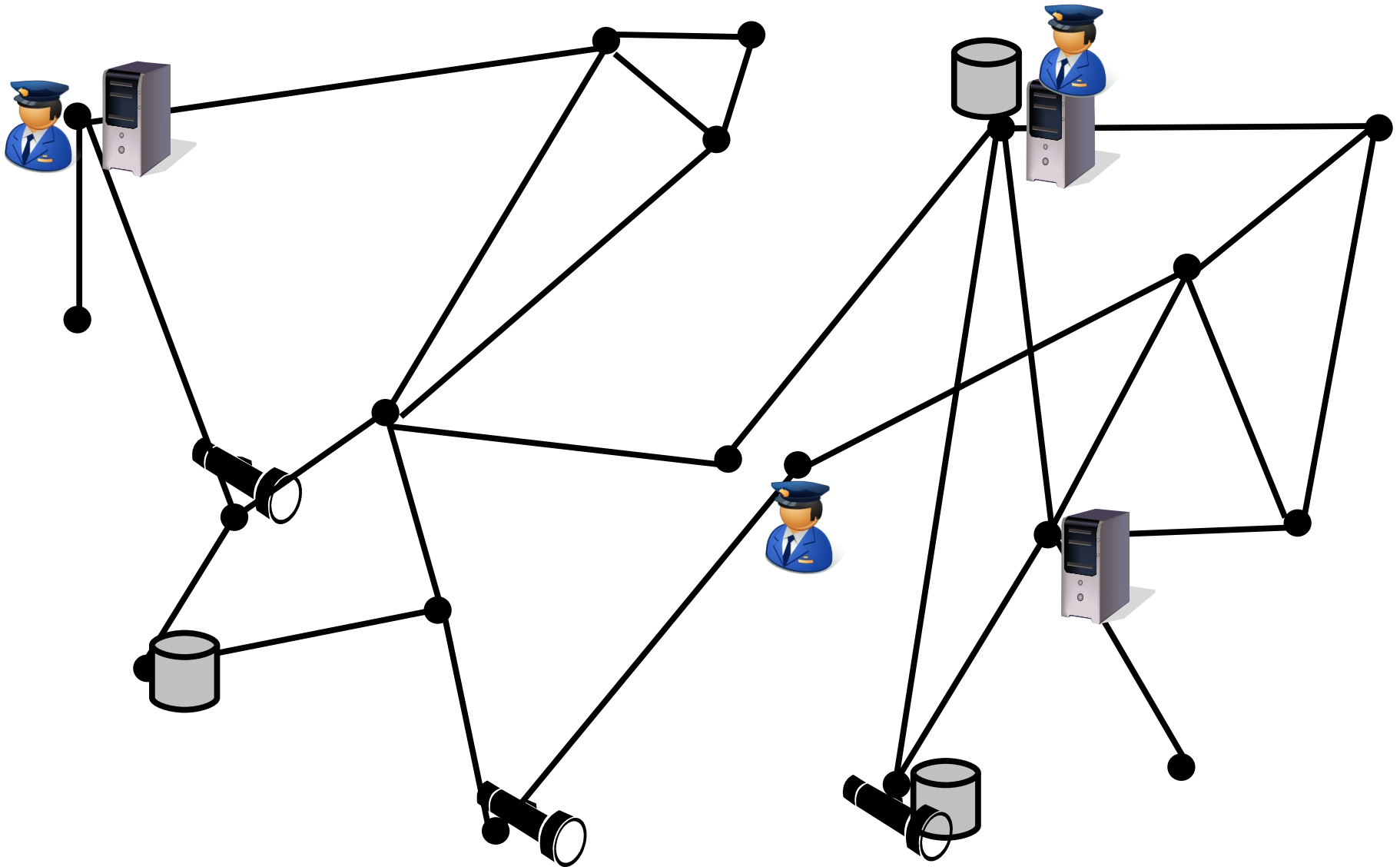


# Centralized Algorithm

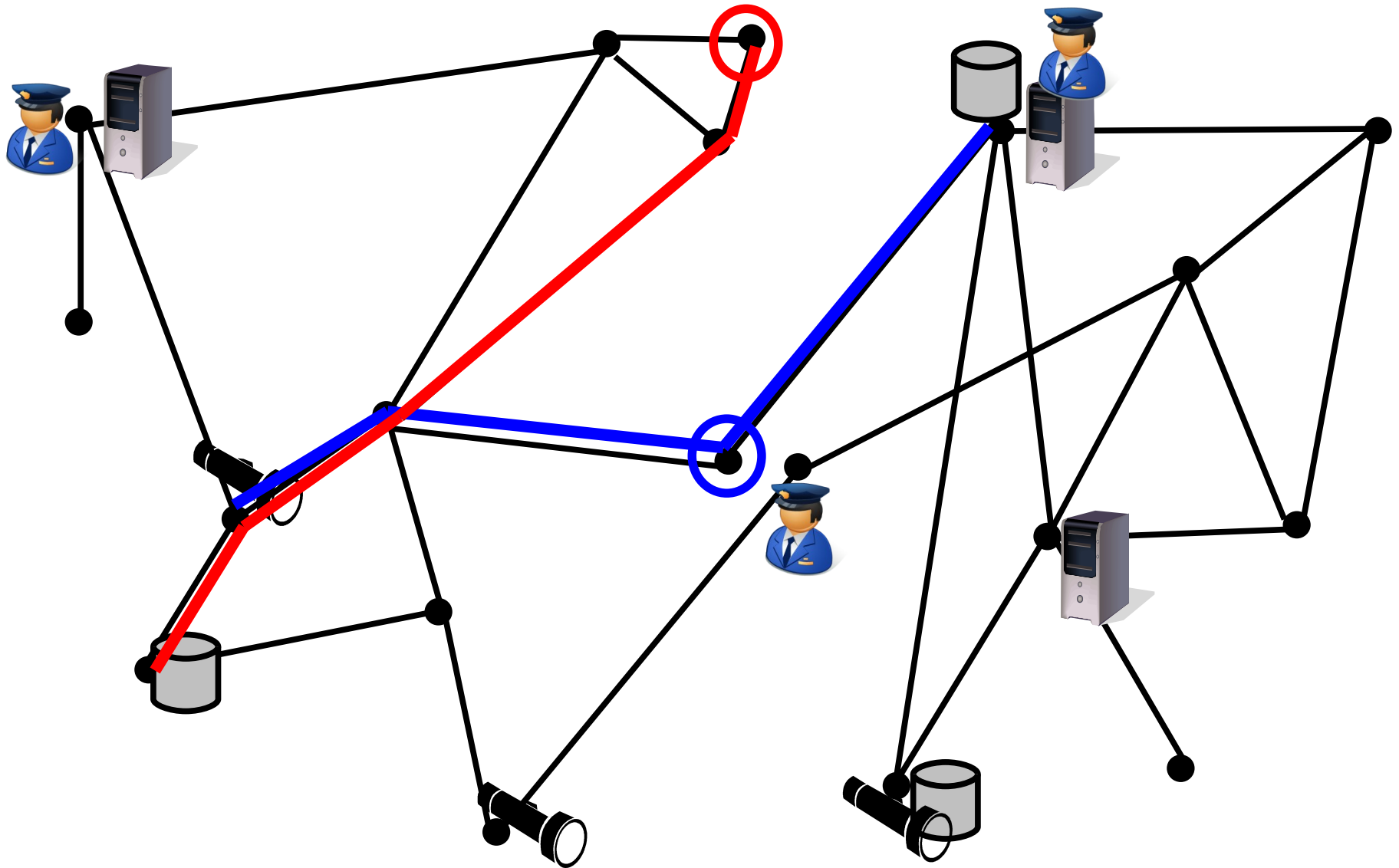




# Centralized Algorithm



# Centralized Algorithm



# Steiner Tree Facility Location

- Network is result of a BBC game
- Each node will pick cheapest subgraph connecting it to commodities of interest

# Steiner Tree Facility Location

- $G = (V, E)$  with edge lengths
- Set  $T$  of types
- Interest sets:  $I(v) = \text{Subset of } T$
- Cost to build type  $t$  at node  $v$ :  $c(t, v)$
- Budget per type  $k(t)$
- Want to find sets  $L(t) \subseteq V$  (for each  $t$ ) to minimize:

$$\sum_{v \in V} x(v) + \sum_{t \in T} \sum_{v \in L(t)} c(t, v)$$

$x(v)$  is the cost of the minimum Steiner tree connecting  $v$  to at least one node in  $L(t)$  for each  $t$  in  $I(v)$

# Related Work on Steiner Tree and Facility Location

- R. Ravi , A. Sinha. Multicommodity facility location. SODA, 2004.
- Naveen Garg , Goran Konjevod , R. Ravi, A polylogarithmic approximation algorithm for the Steiner group tree problem, SODA, 1998.

# Steiner Tree Facility Location

- Most general version: would also solve Group Steiner problem, which is NP hard to approximate to better than  $O(\log^2 n)$ , even on trees.
- Simplifications:
  - Set  $c(t,v) = c(t,u)$  for all  $u,v$  (9-approximation on trees)
  - Also set  $k(t) = 1$  for all  $t$  (solve optimally on trees)

# What if commodity building were part of the game?

- A single additional player who is trying to solve STFL.
- Each commodity is its own player.
- How does the fact that our graph was created as a result of a game help or hurt the algorithm? The equilibria in the game?

# Results Mentioned are from...

- Nikolaos Laoutaris, Laura J. Poplawski, Rajmohan Rajaraman, Ravi Sundaram, Shang-Hua Teng. *Bounded Budget Connection (BBC) Games or How to Make Friends and Influence People, on a Budget*. In PODC '08, pages 165–174, 2008.
- Nikolaos Laoutaris, Laura J. Poplawski, Rajmohan Rajaraman, Ravi Sundaram, Shang-Hua Teng. *Bounded Budget Connection (BBC) Games or How to make friends and influence people, on a budget*. arXiv:0806.1727v1 [cs.GT]
- Laura J. Poplawski, Rajmohan Rajaraman, Ravi Sundaram, Shang-Hua Teng. *Preference Games and Personalized Equilibria, with Applications to Fractional BGP*. arXiv:0812.0598v2 [cs.GT]



# Thesis Plan

## February - March

MARCH 2009

Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
2	3	4	5	6	7

FEBRUARY 2009

Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Sunday
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28

- Uniform Fractional BBC Game,  $k=1$
- More on the Preference Game
- Integral BBC Game, all uniform except budget, all uniform except length.

# Thesis Plan

## April - June

JUNE 2009

Tuesday	Wednesday	Thursday	Friday	Saturday
2	3	4	5	6

MAY 2009

Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
				1	2

APRIL 2009

Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
			1	2	3	4
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30		

- STFL: general problem approximation algorithm
- Commodities are controlled by BBC players

# Thesis Plan

## July - August

- Follow loose ends
- Write thesis
- Defense

AUGUST 2009

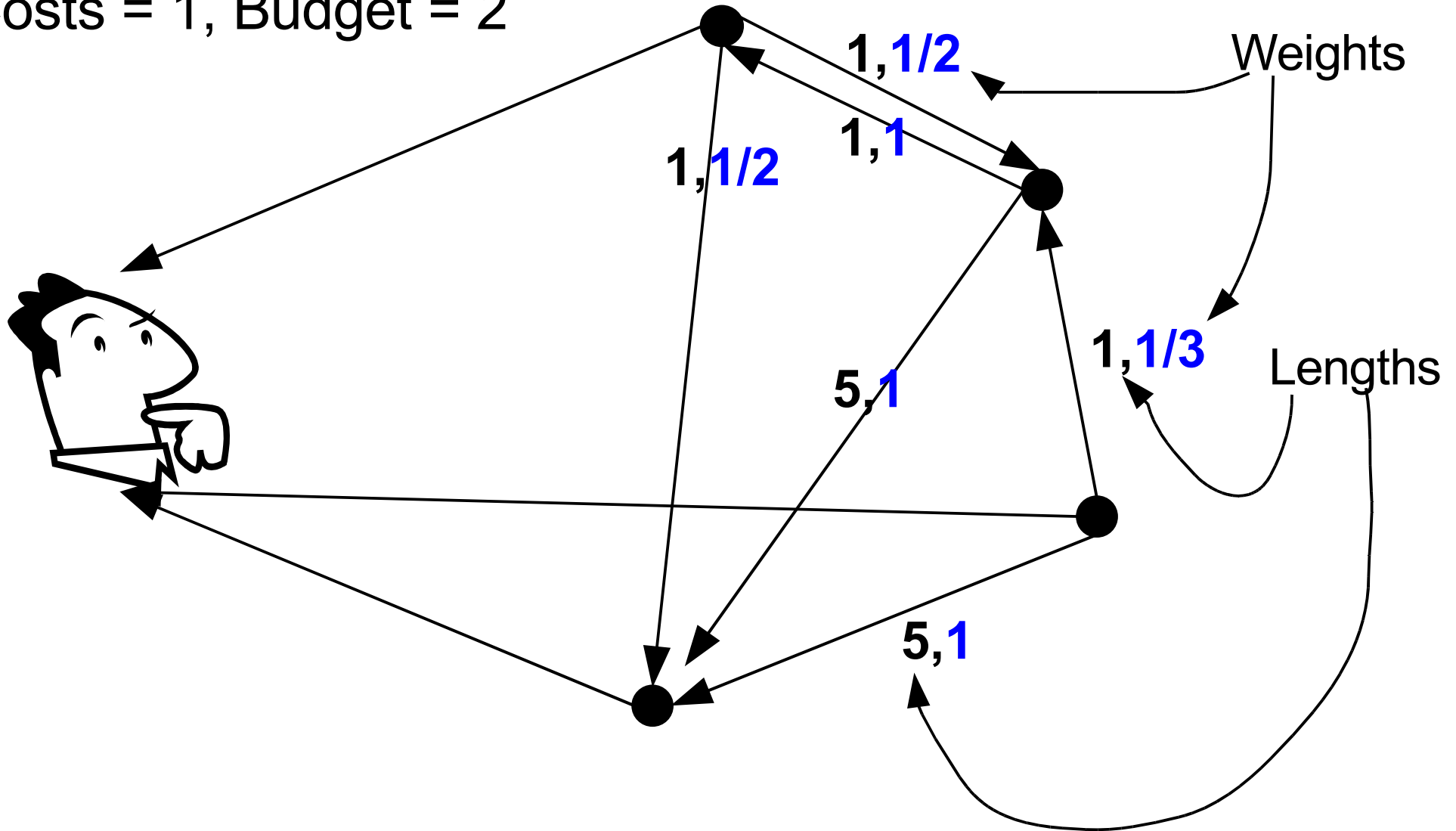
Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
					1
3	4	5	6	7	8

JULY 2009

Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
			1	2	3	4
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	

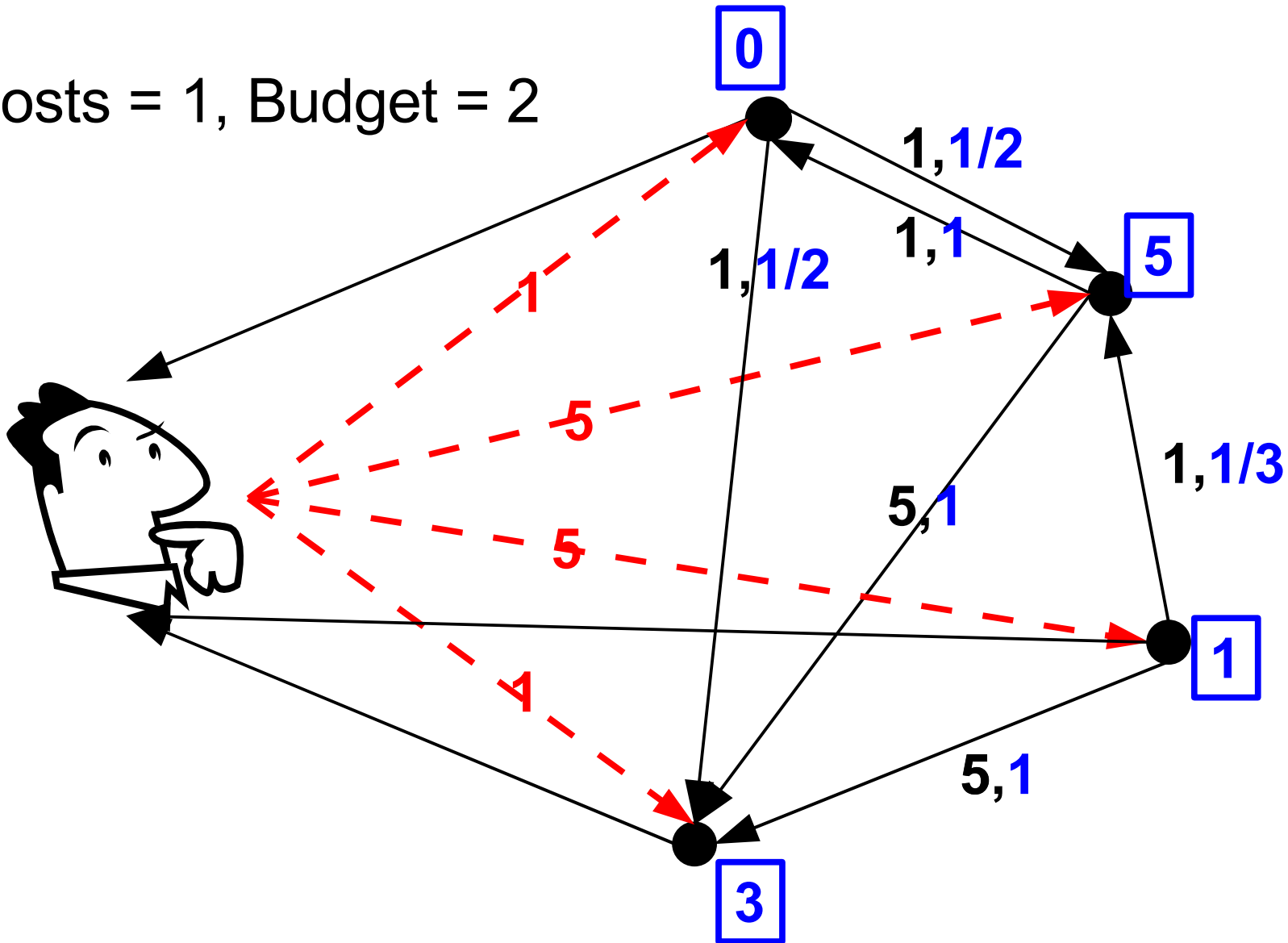
# Example

Costs = 1, Budget = 2



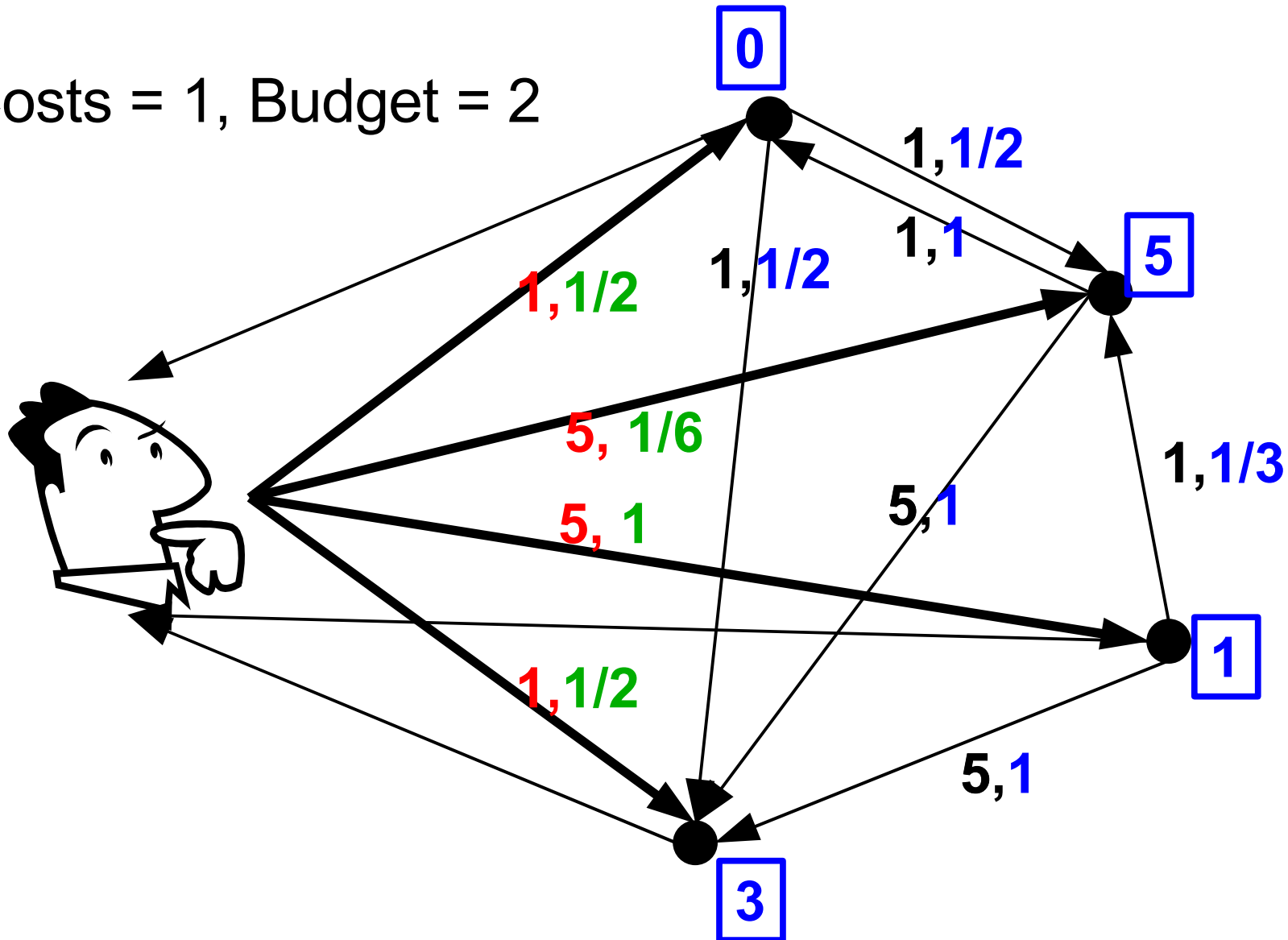
# Example

Costs = 1, Budget = 2



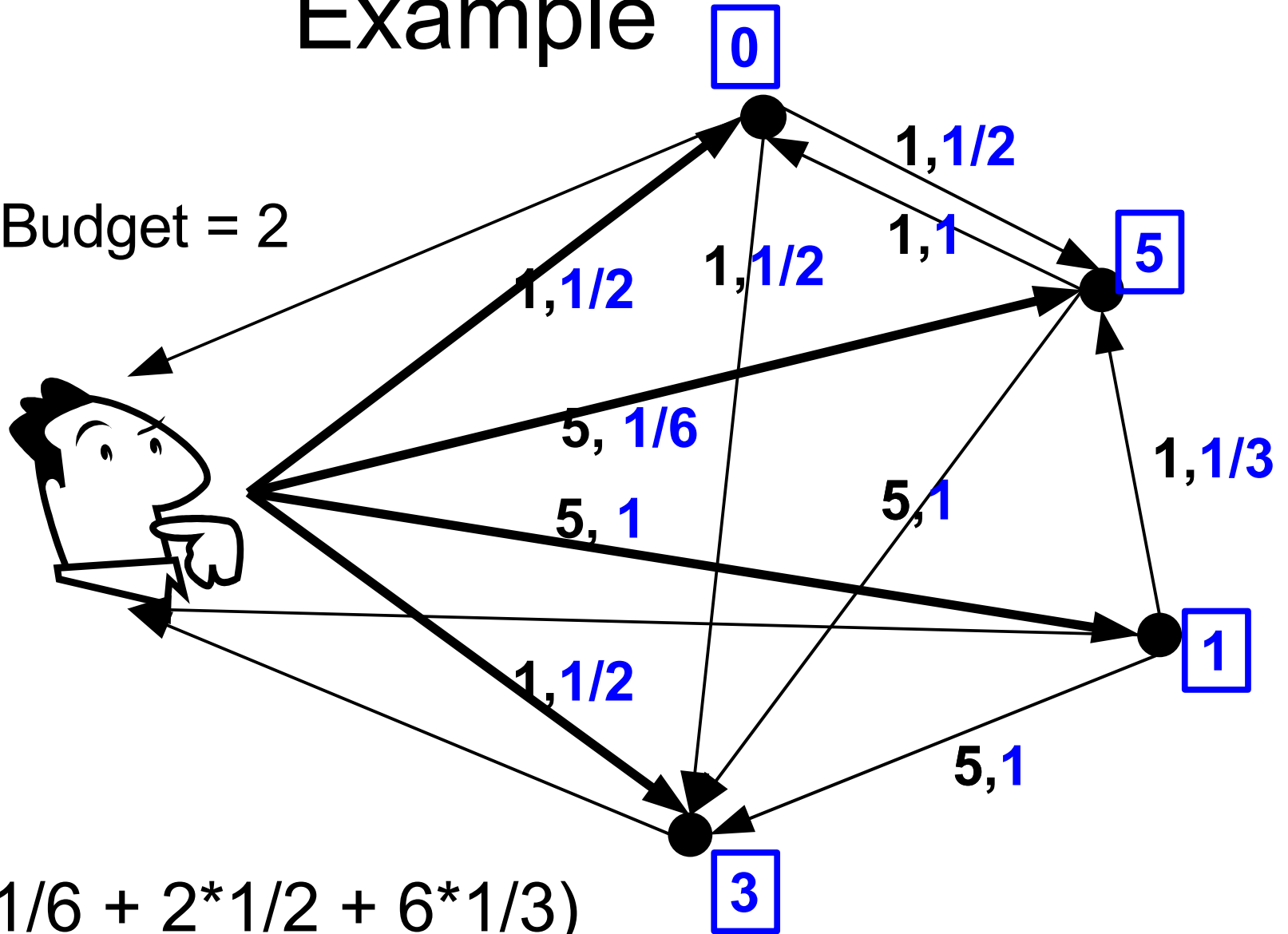
# Example

Costs = 1, Budget = 2



# Example

Costs = 1, Budget = 2



$$\begin{aligned} \text{Cost} &= 5(5 \cdot 1/6 + 2 \cdot 1/2 + 6 \cdot 1/3) \\ &+ 1(5) + 3(2 \cdot 1/2 + 1 \cdot 1/2) \\ &= 28 \frac{2}{3} \end{aligned}$$