

# MAKING NETWORKS ROBUST TO COMPONENT FAILURE

A Dissertation Outline presented by Daniel Gyllstrom  
University of Massachusetts Amherst USA  
Advisor: Jim Kurose

# Talk Outline

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- thesis introduction

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- describe 3 technical chapters

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Gyllstrom, Rosensweig  
and Kurose, *e-Energy 2012*

Gyllstrom, Vasudevan and Kurose,  
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# Thesis Problem Statement

How can networks -- Internet, wireless networks, & networked cyber-physical systems -- be made more robust to component failure?

# 3 Component Failure Problems

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1. failure of critical power grid sensors

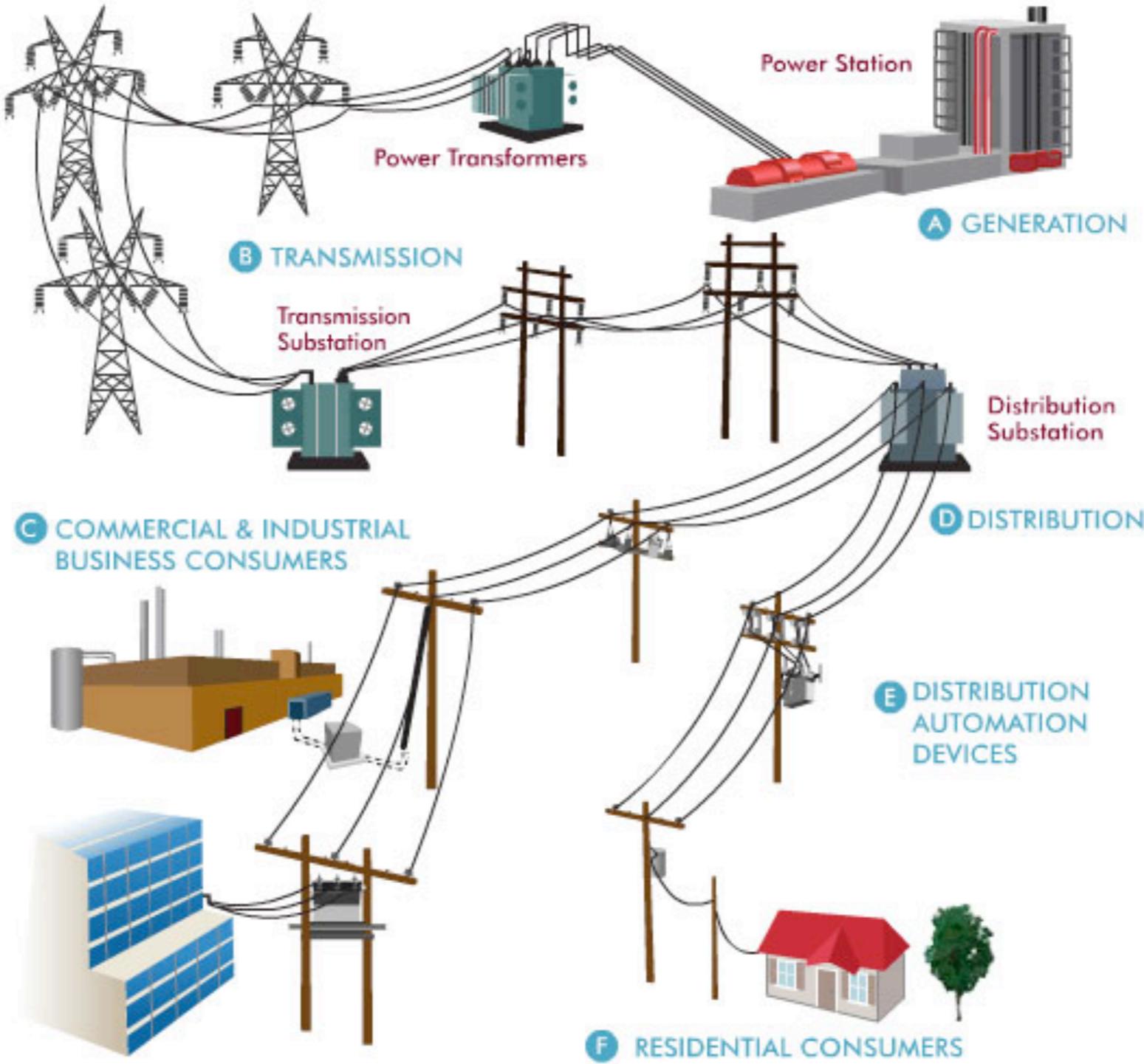
# 3 Component Failure Problems

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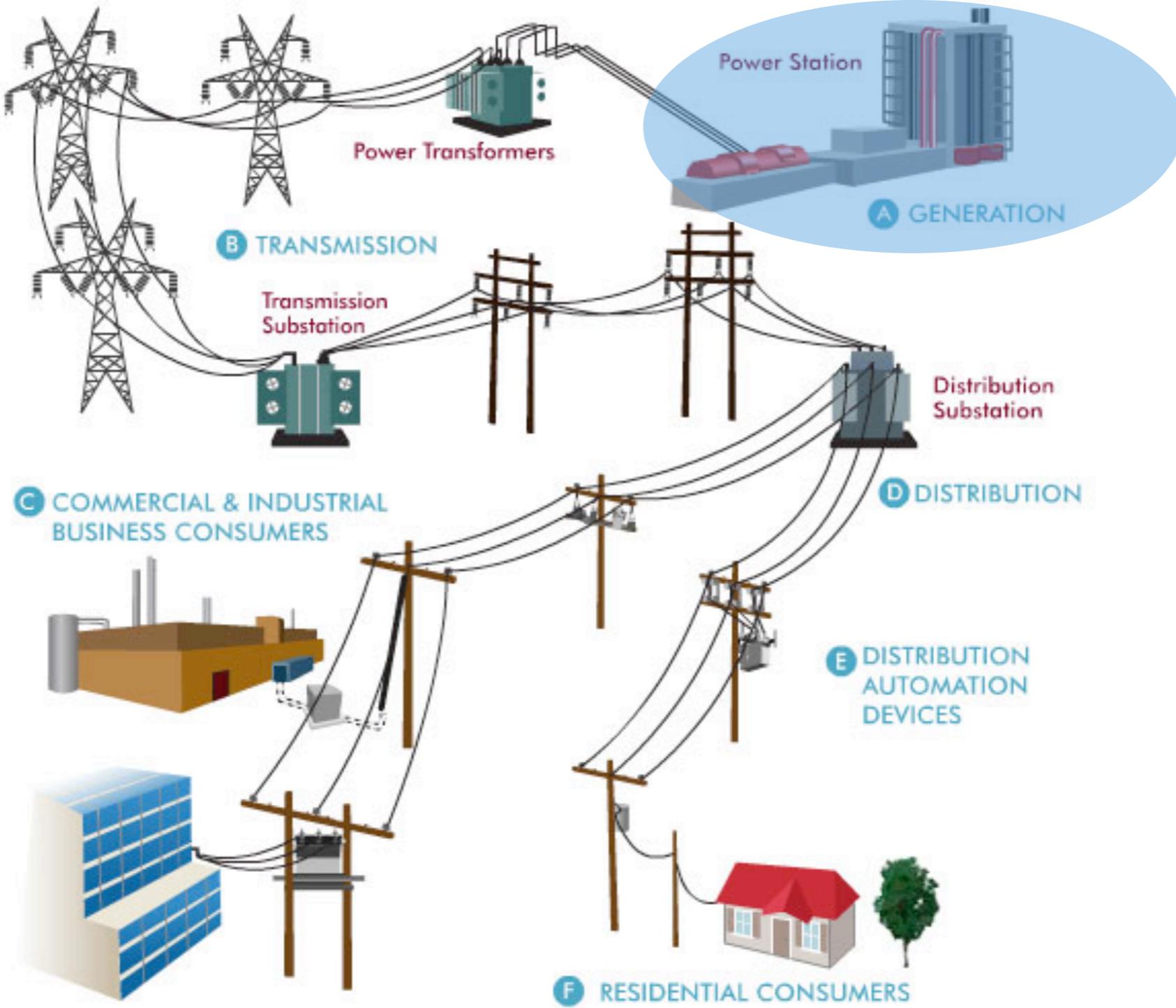
1. failure of critical power grid sensors
2. link failures in a power grid communication network
3. router failure in traditional communication networks

# Power and Smart Grid Definition



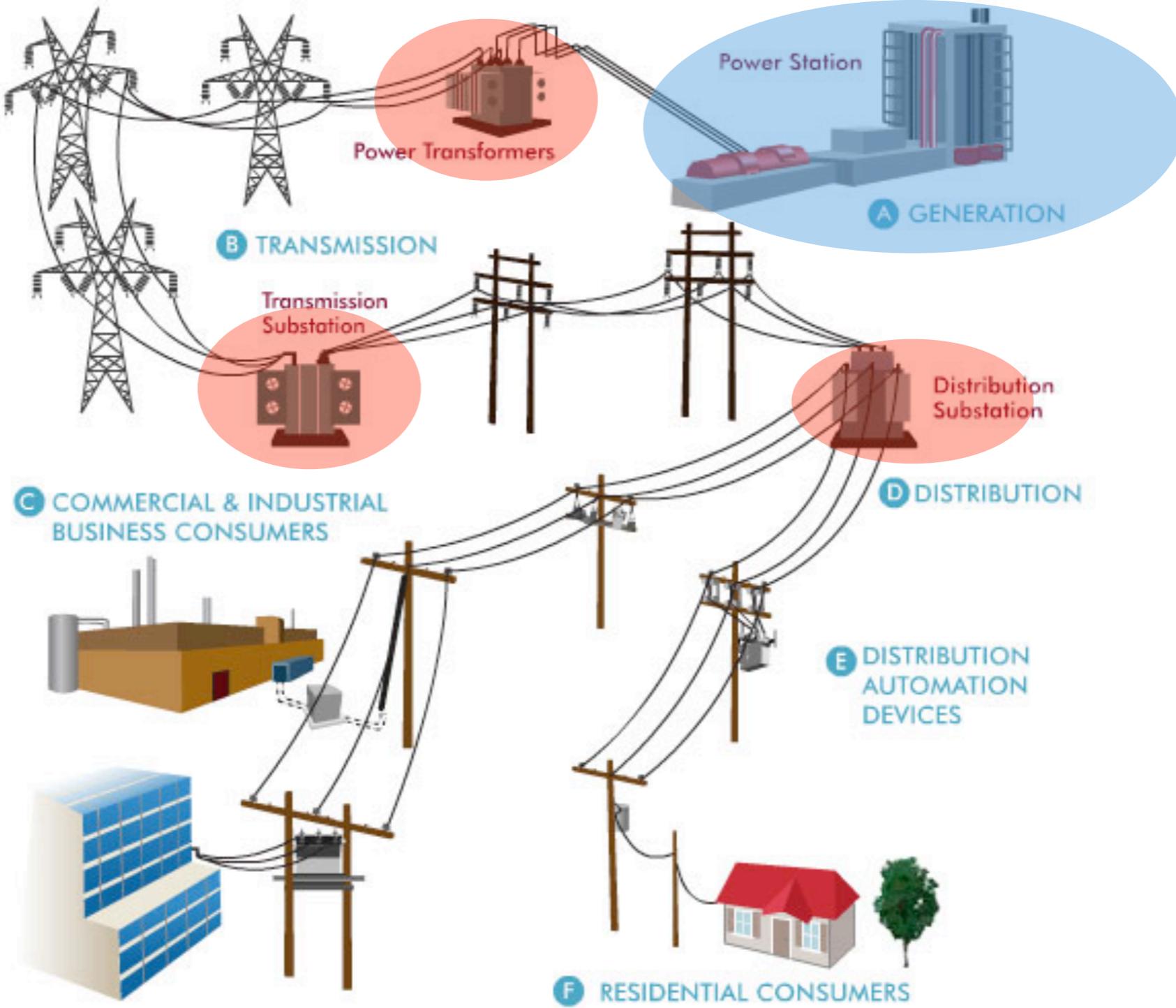
- power grid consists of buses (nodes) + transmission lines connecting buses

# Power and Smart Grid Definition



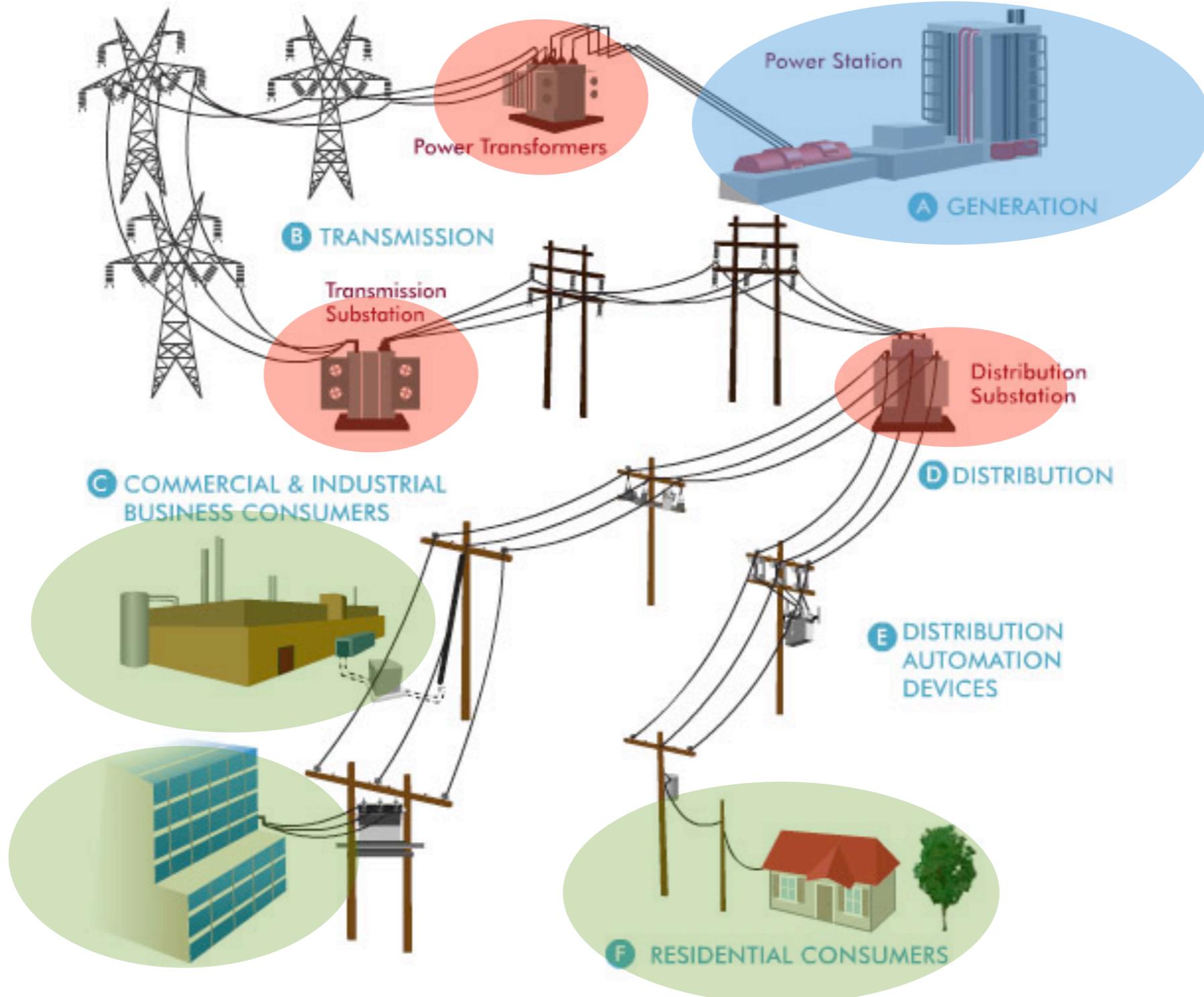
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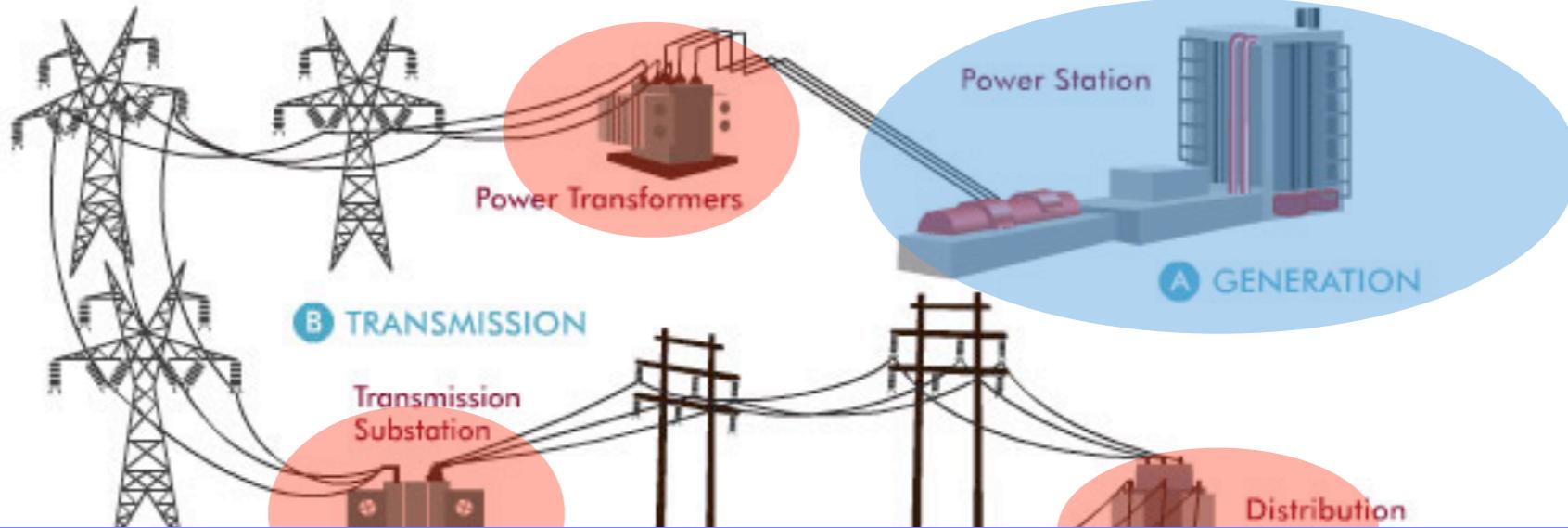
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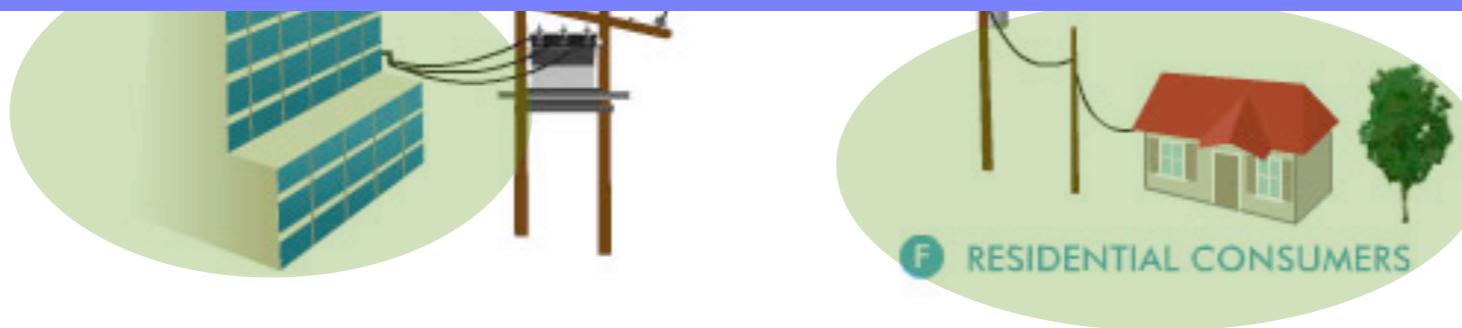


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# Power and Smart Grid Definition



smart grid  $\approx$  power grid + (sensors,  
computers, wide-area communication to  
operate & manage the grid)



- power grid consists of buses (nodes) + transmission lines connecting buses

# PMU: Smart Grid Sensor



- Phasor Measurement Unit (PMU)
- high frequency voltage and current measurements
  - ▶ measures the “pulse” of the power grid

# Ch 1+2: Smart Grid Failures

- Ch 1: PMU sensor failure
- Ch 2: link failures in communication network used to disseminate PMU measurements

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these failures can cause critical errors in smart grid applications used to operate the grid

# India blackouts leave 700 million without power

Power cuts plunge 20 of India's 28 states into darkness as energy suppliers fail to meet growing demand

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**Helen Pidd** in Delhi

The Guardian, Tuesday 31 July 2012 10.48 EDT

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More than 700 million people in [India](#) have been left without power in the world's worst blackout of recent times, leading to fears that protests and even riots could follow if the country's electricity supply continues to fail to meet growing demand.

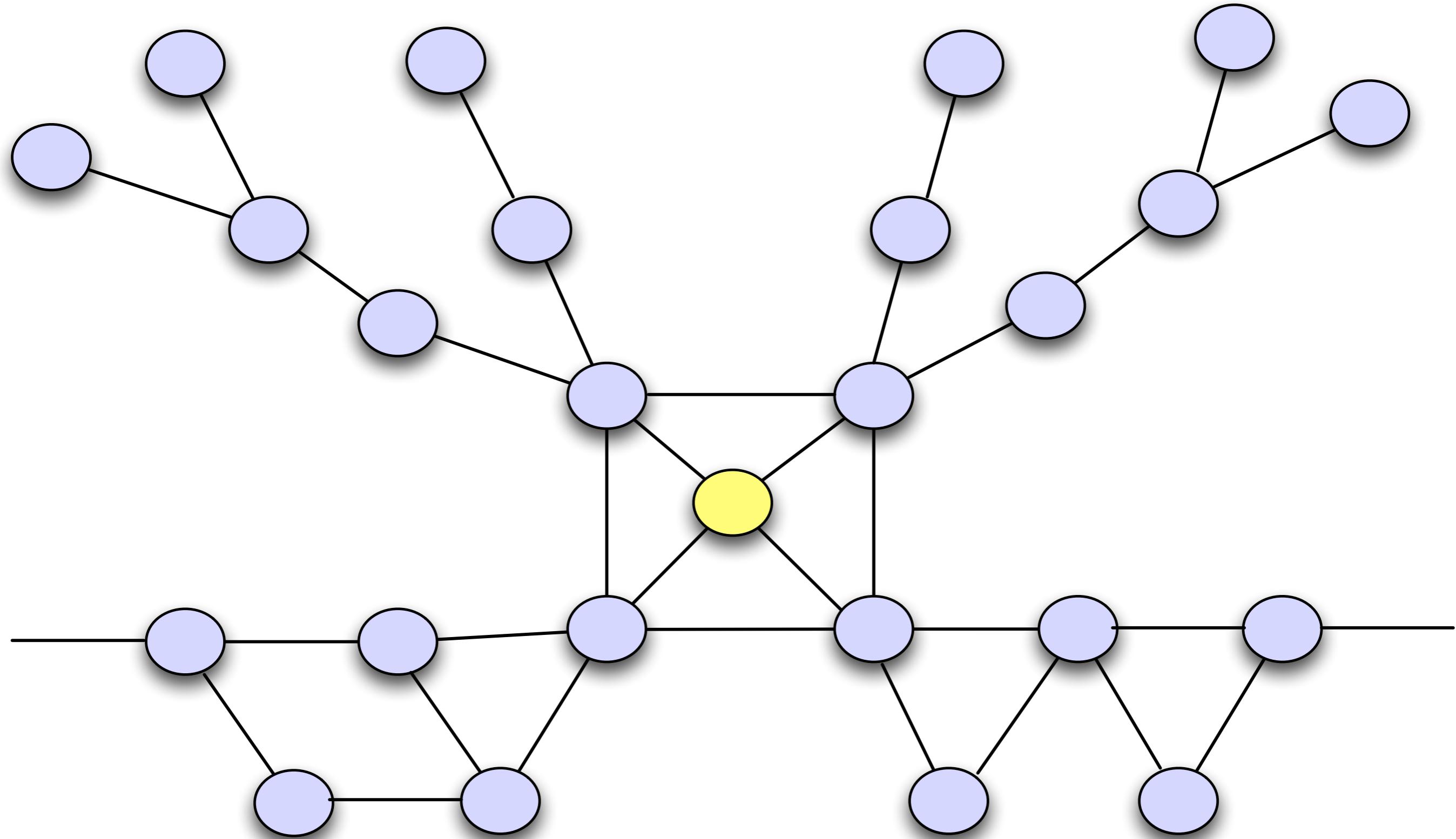
Twenty of India's 28 states were hit by power cuts, along with the capital, New Delhi, when three of the country's five electricity grids failed at lunchtime.

As engineers struggled for hours to fix the problem, hundreds of trains failed, leaving passengers stranded along thousands of miles of track from Kashmir in the north to Nagaland on the eastern border with Burma.

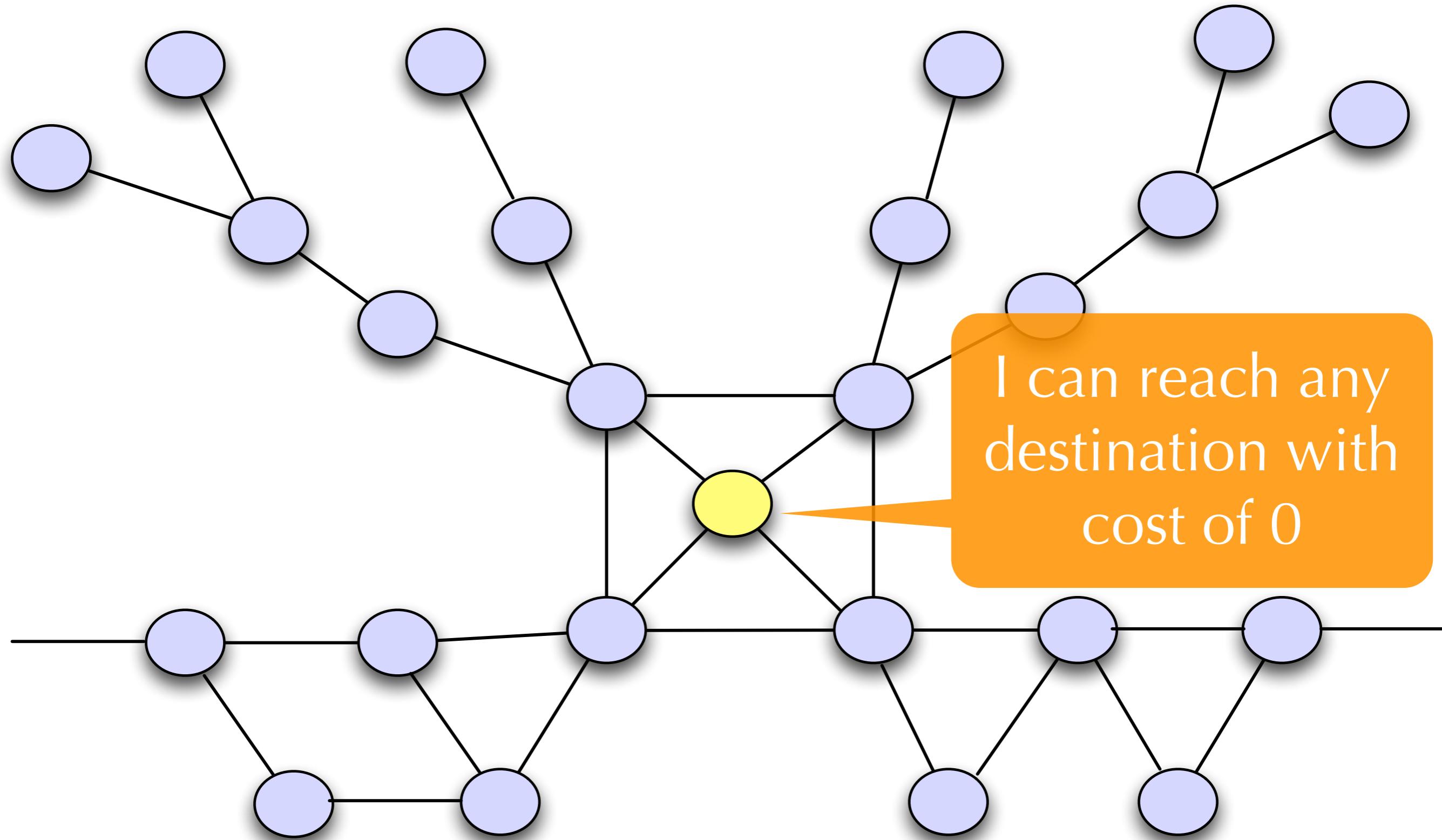
Traffic lights went out, causing jams in New Delhi, Kolkata and other cities. Surgical operations were cancelled across the country, with nurses at one hospital just outside Delhi having to operate life-saving equipment manually when back-up generators failed.

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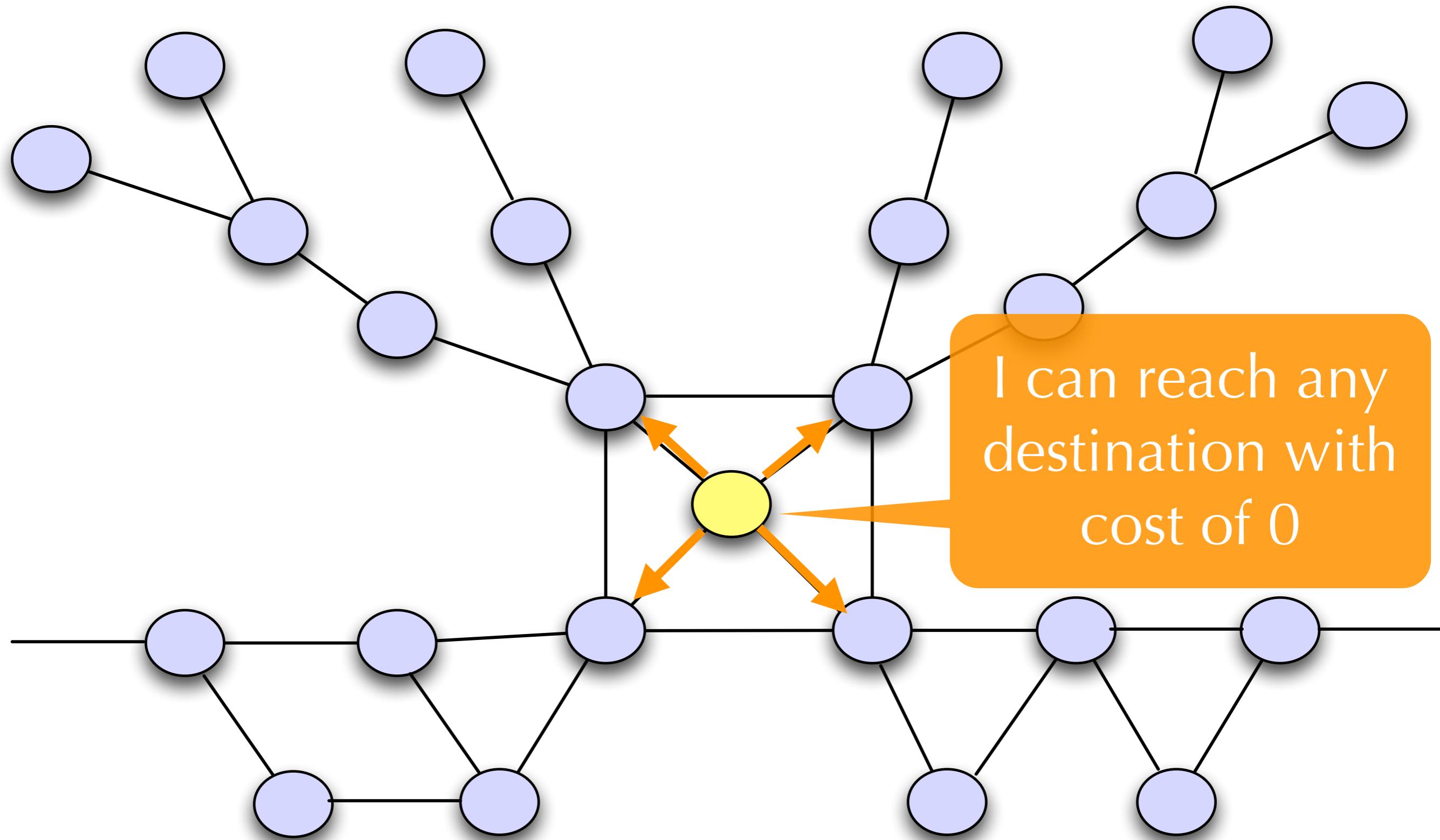
# Ch 3: Network Router Failure



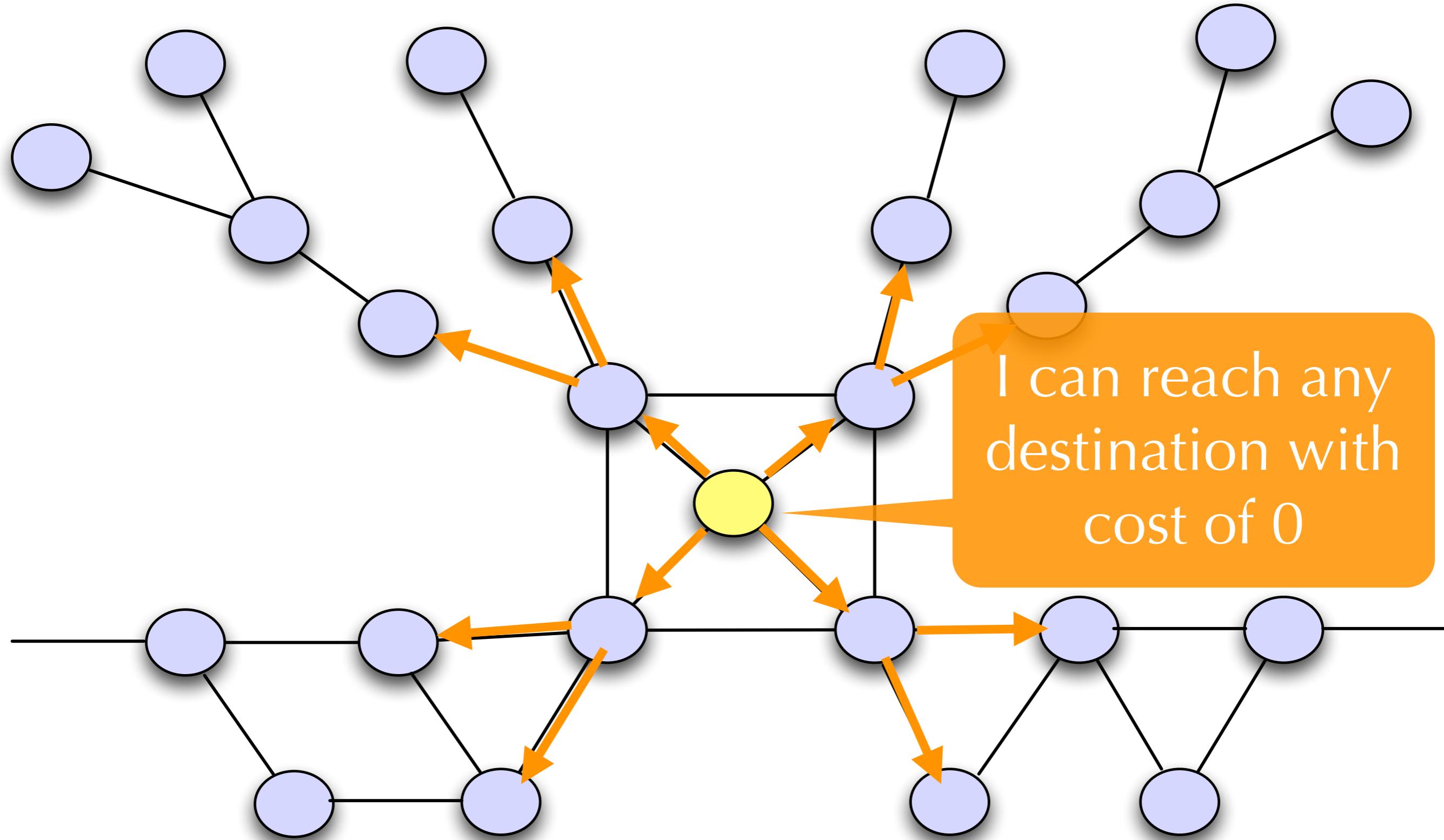
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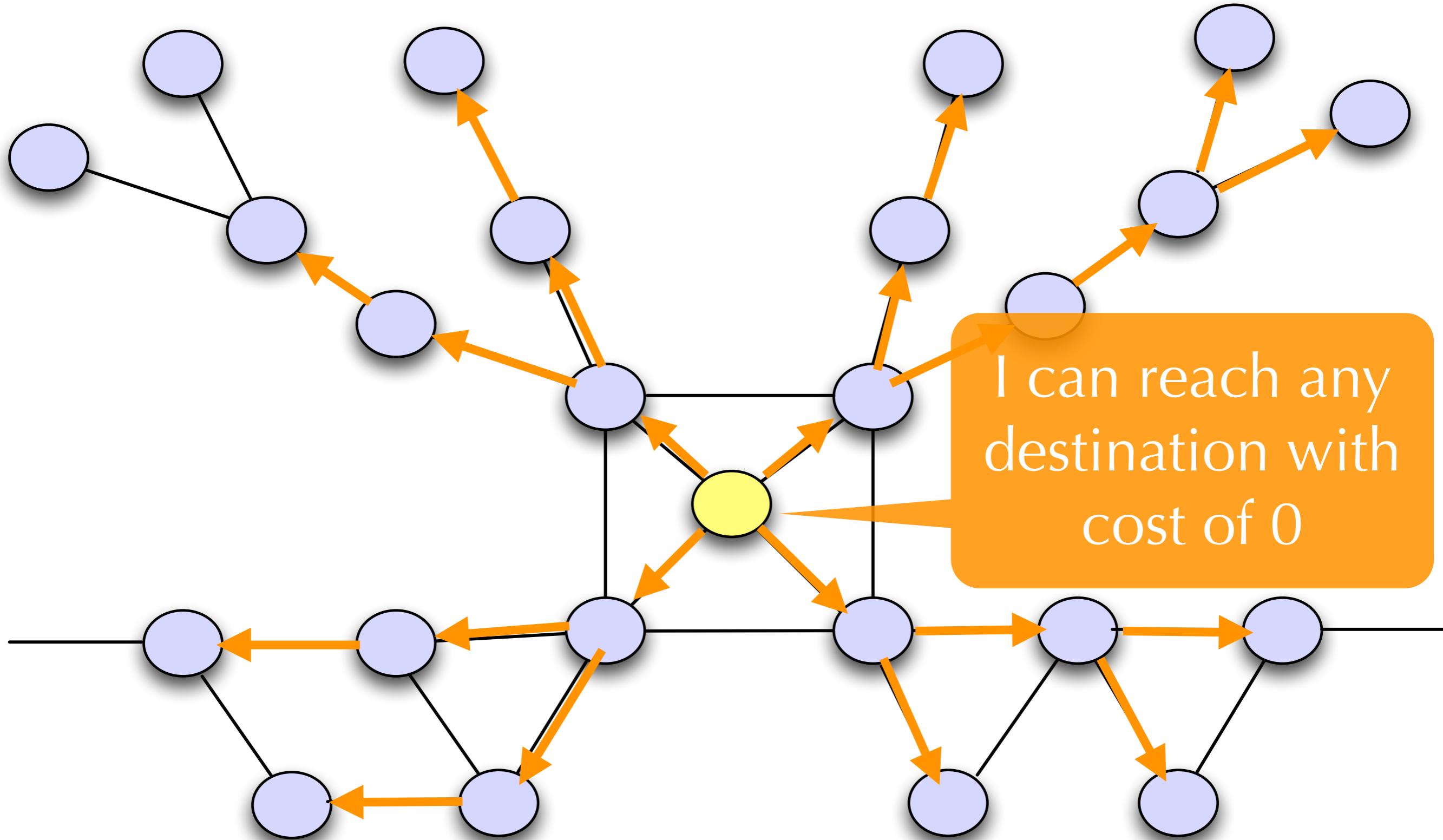
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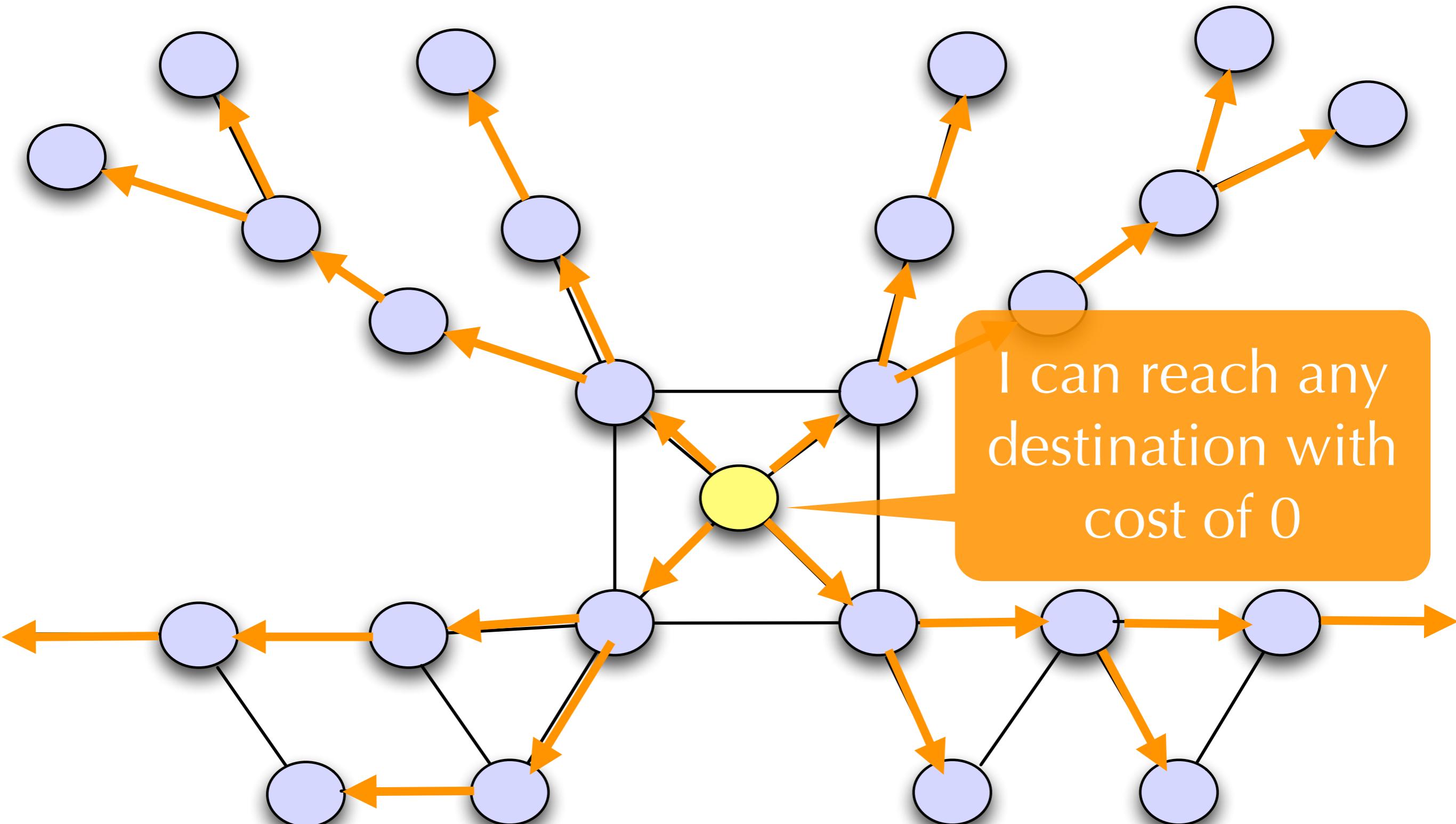
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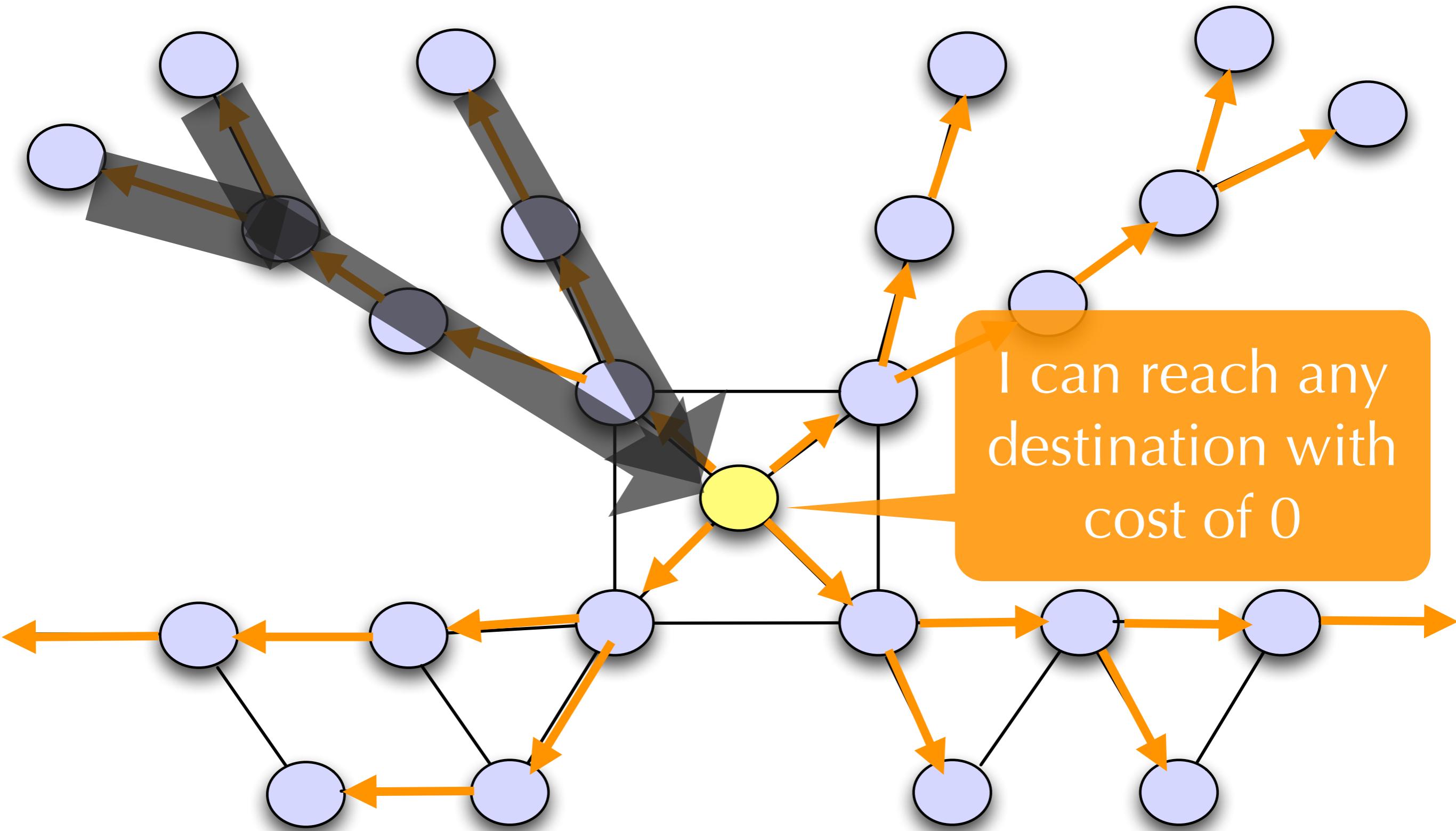
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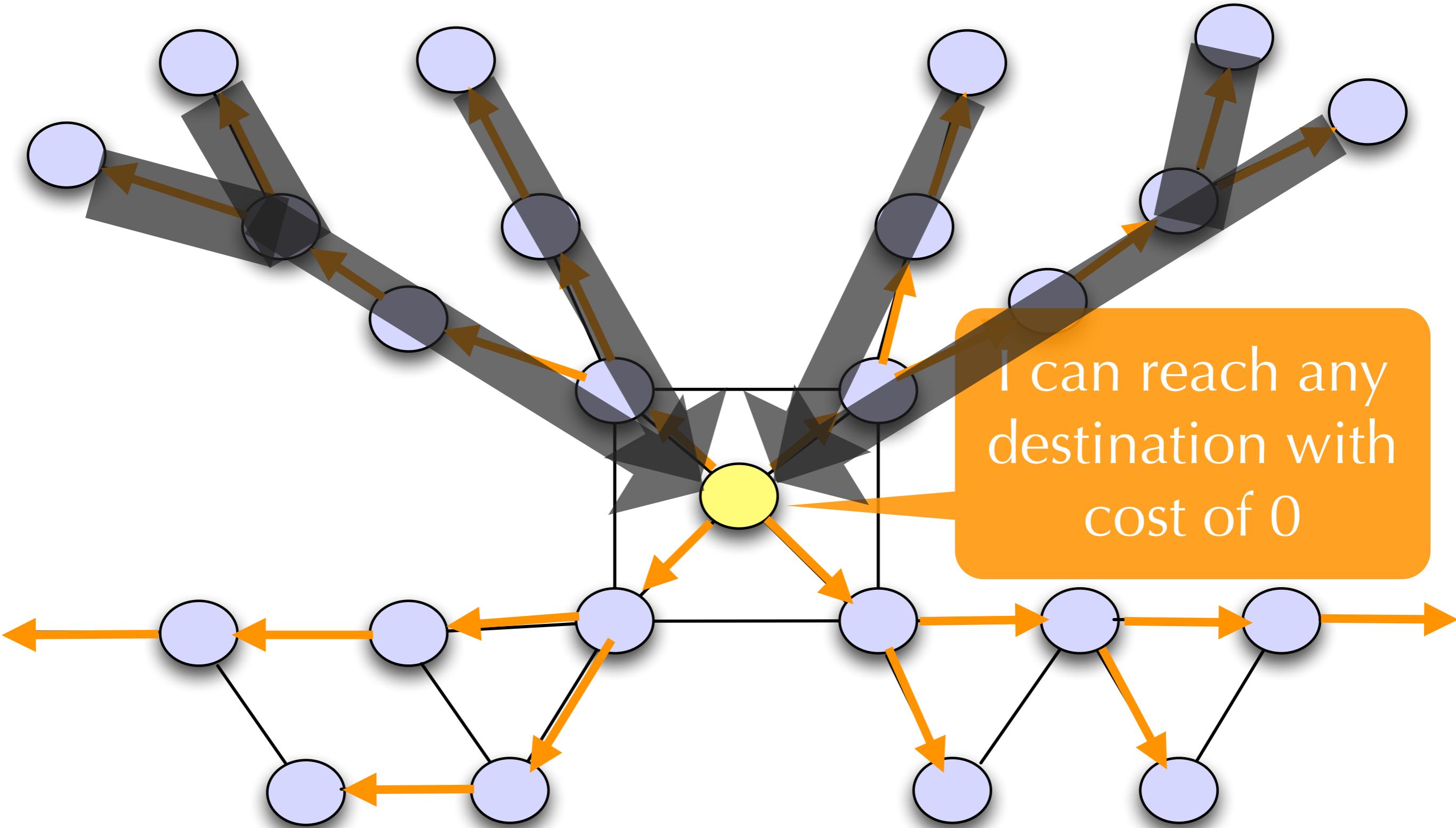
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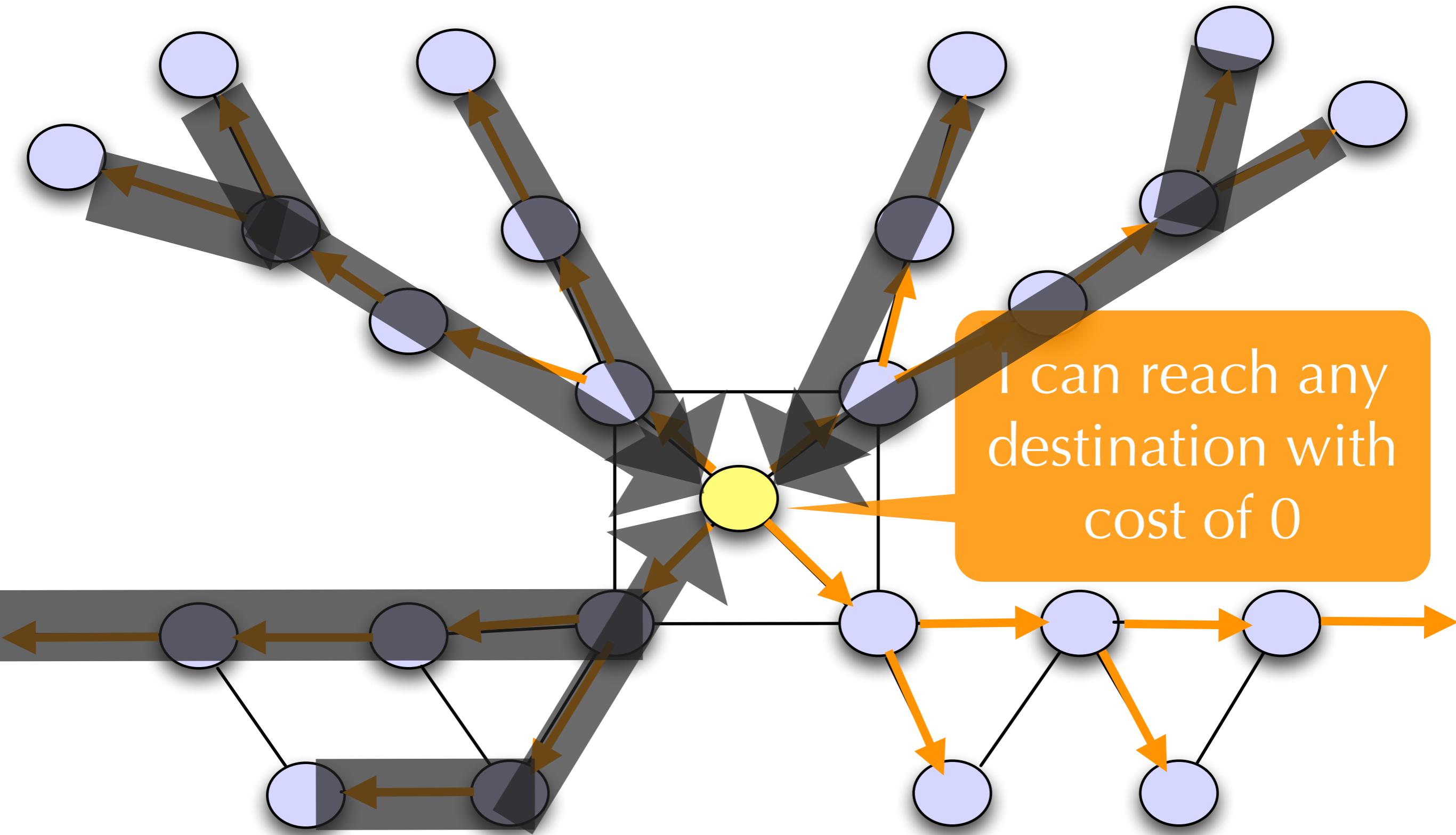
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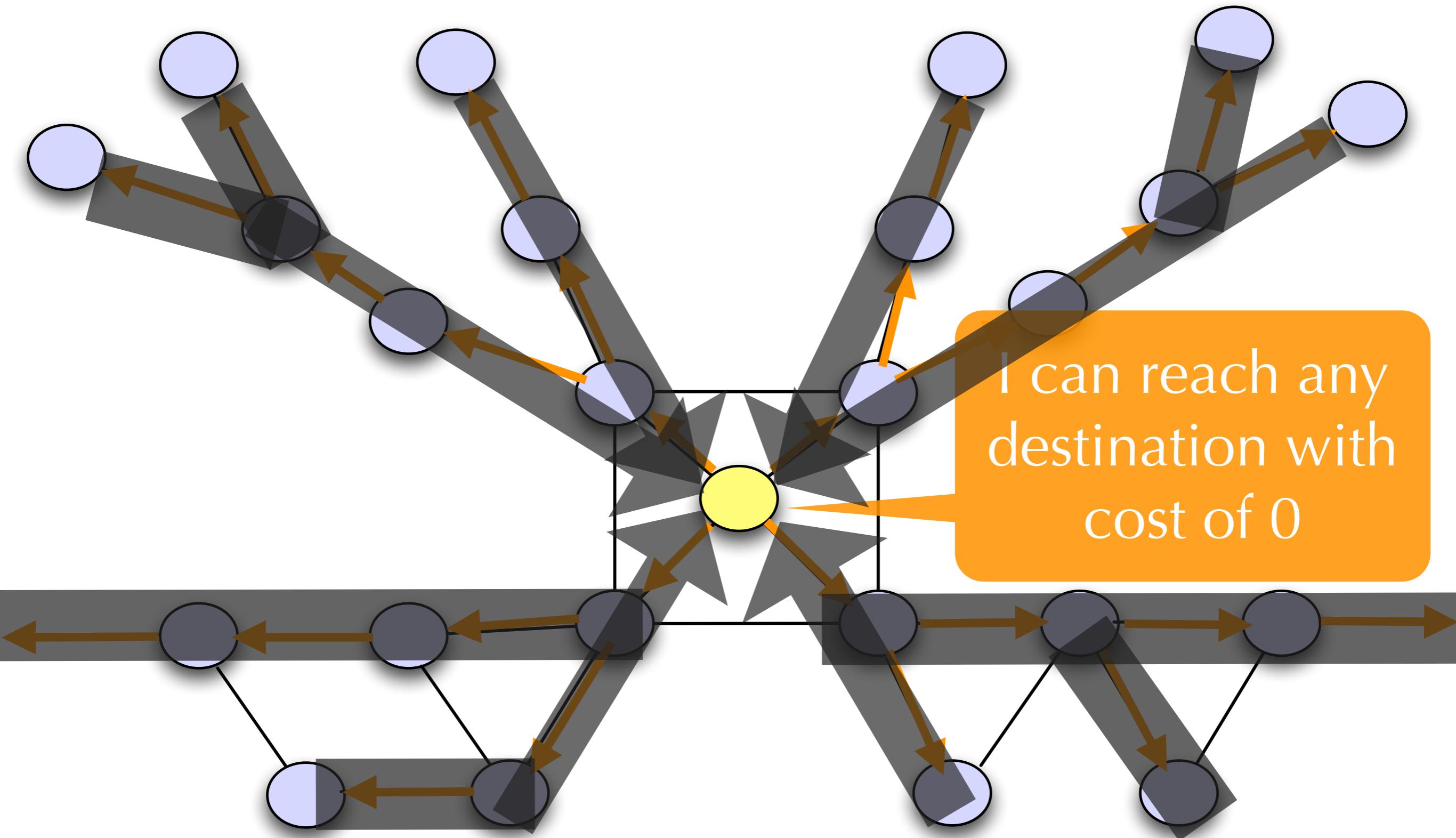
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April 25, 1997 7:00 PM PDT

# Router glitch cuts Net access

By [CNET News.com Staff](#)  
Staff Writer, CNET News

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[Net blackout hits some regions](#)

April 25, 1997

[Software blamed for AOL blackout](#)

February 5, 1997

[WorldNet service restored](#)

November 9, 1996

[Web gets an Olympian workout](#)

July 13, 1996

What started out as a router glitch at a small Internet service provider in Virginia today triggered a major outage in Internet access across the country, lasting more than two hours in some places.

The problem started this morning at 8:30 a.m. PT when MAI Network Services, an ISP headquartered in a McLean, Virginia, unwittingly passed some bad router information from one of its customers onto [Sprint](#), one of the largest Internet backbone operators in North America. Because Sprint's backbone is used by so many other smaller ISPs, the router problem was echoed, causing temporary network outages across the country and, perhaps, internationally.

The outage underscored the fragility of the infrastructure that underlies the global network and how easily a problem with one small ISP can be amplified throughout the Internet. Even so, the Net displayed a remarkable resilience that seems to disprove its doomsayers, who have predicted that the network is on the verge of collapse.

"This particular thing was a confluence of two or three things happening--human error, bug, and some policy problems--that all came together on the same day," said Jack Rickard, publisher of [BoardWatch](#) magazine.

"There are probably a hundred guys in back rooms keeping this stuff together, just barely," Rickard said of the Internet.

# Automated Recovery Is Needed

- automated recovery needed to reduce
  - ▶ short-term disruption
  - ▶ increase long-term network survivability

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this thesis designs algorithms to make networks robust to these component failures

# Unifying The 3 Subproblems

- each problem considers network robustness in the face of component failure
- our solutions
  - ▶ preplanned recovery for smart grid apps where reliability is key
  - ▶ on-demand recovery for distributed network algorithms

# Contributions (1/3)

1. define 4 new problems for smart grid sensor placement that aim to max measurement coverage + provide measurement error detection
  - ▶ prove each is NP-Complete
  - ▶ develop approximation algs + evaluate w/ simulations

# Contributions (2/3)

2. define problem of recovery from link failure in smart grid communication network
  - ▶ outline OpenFlow-based link failure detection algorithm
  - ▶ outline 3 algs to compute backup multicast trees

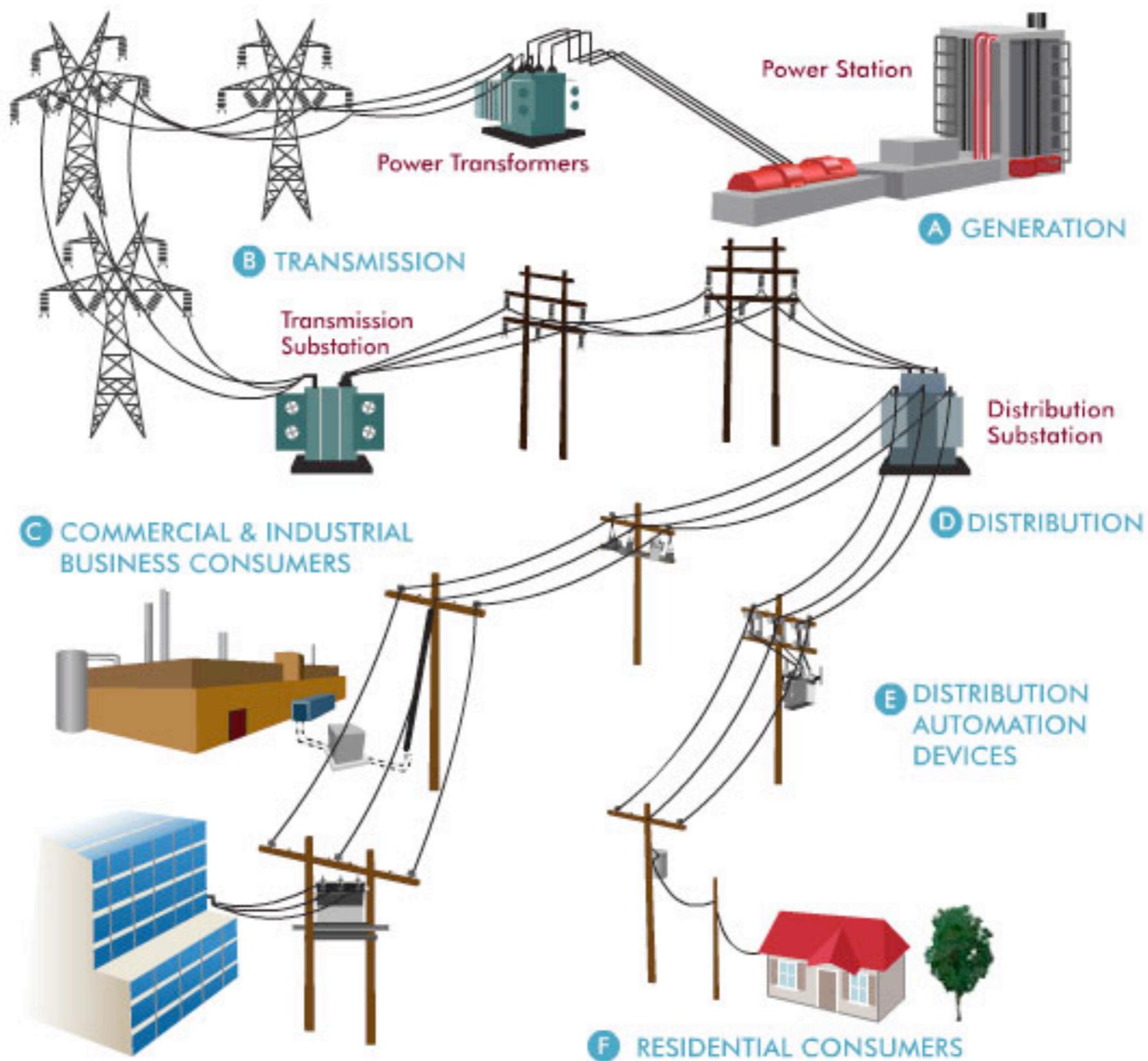
# Contributions (3/3)

3. design + develop 3 new algorithms for recovery from injection of false state in distributed sys.
  - ▶ evaluate w/ simulations + derive complexity bounds

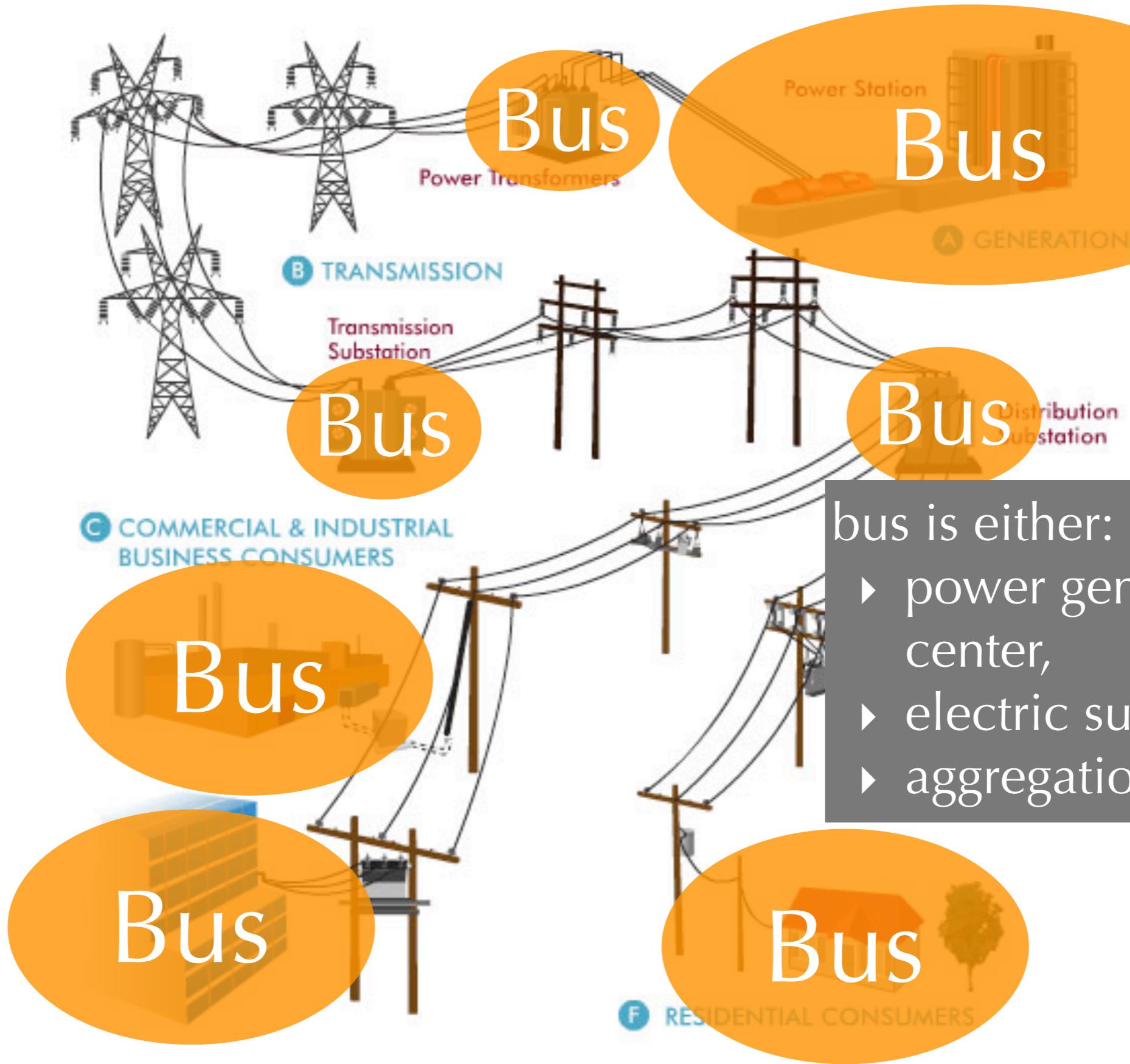
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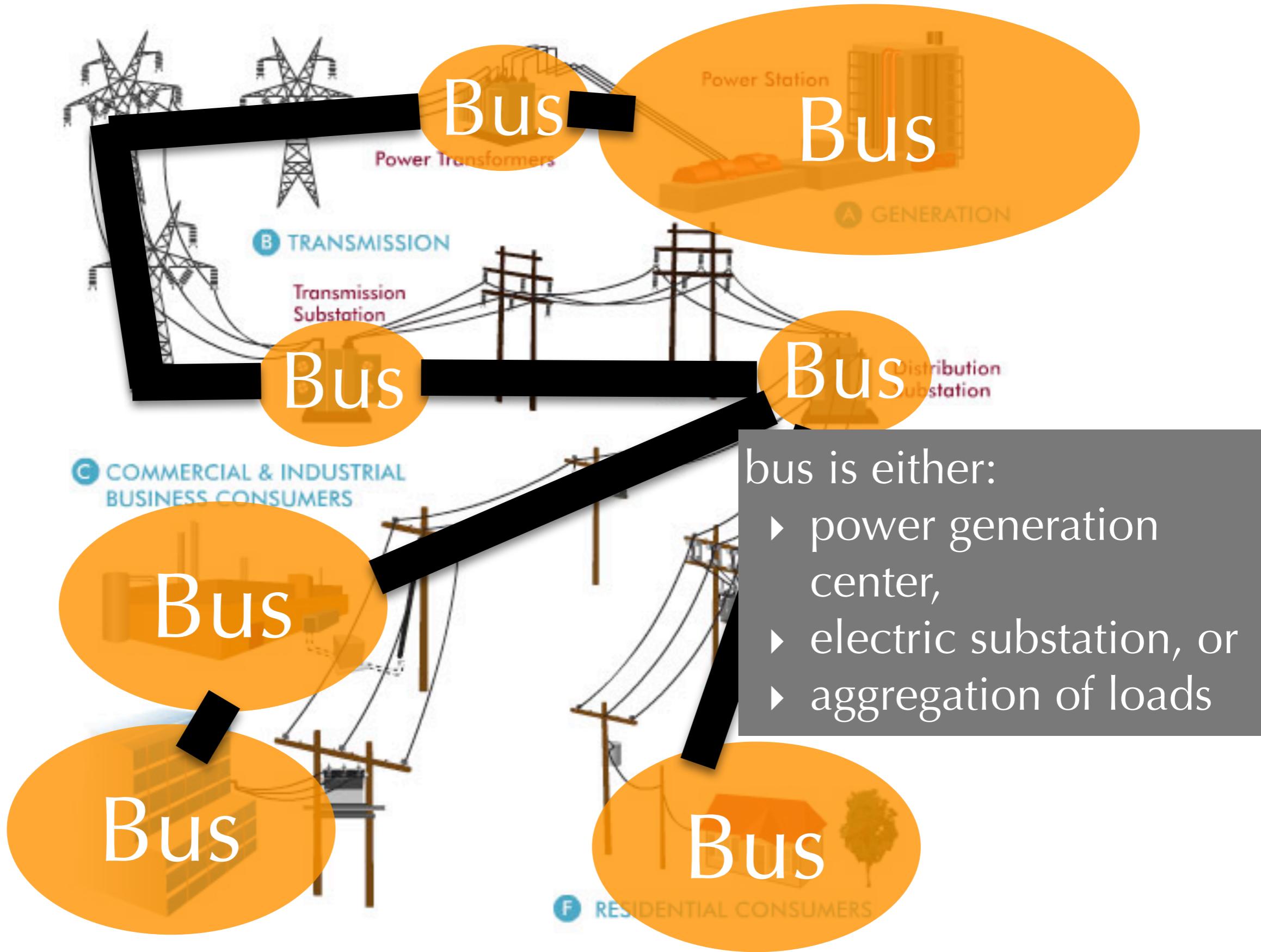
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bus is either:

- ▶ power generation center,
- ▶ electric substation, or
- ▶ aggregation of loads

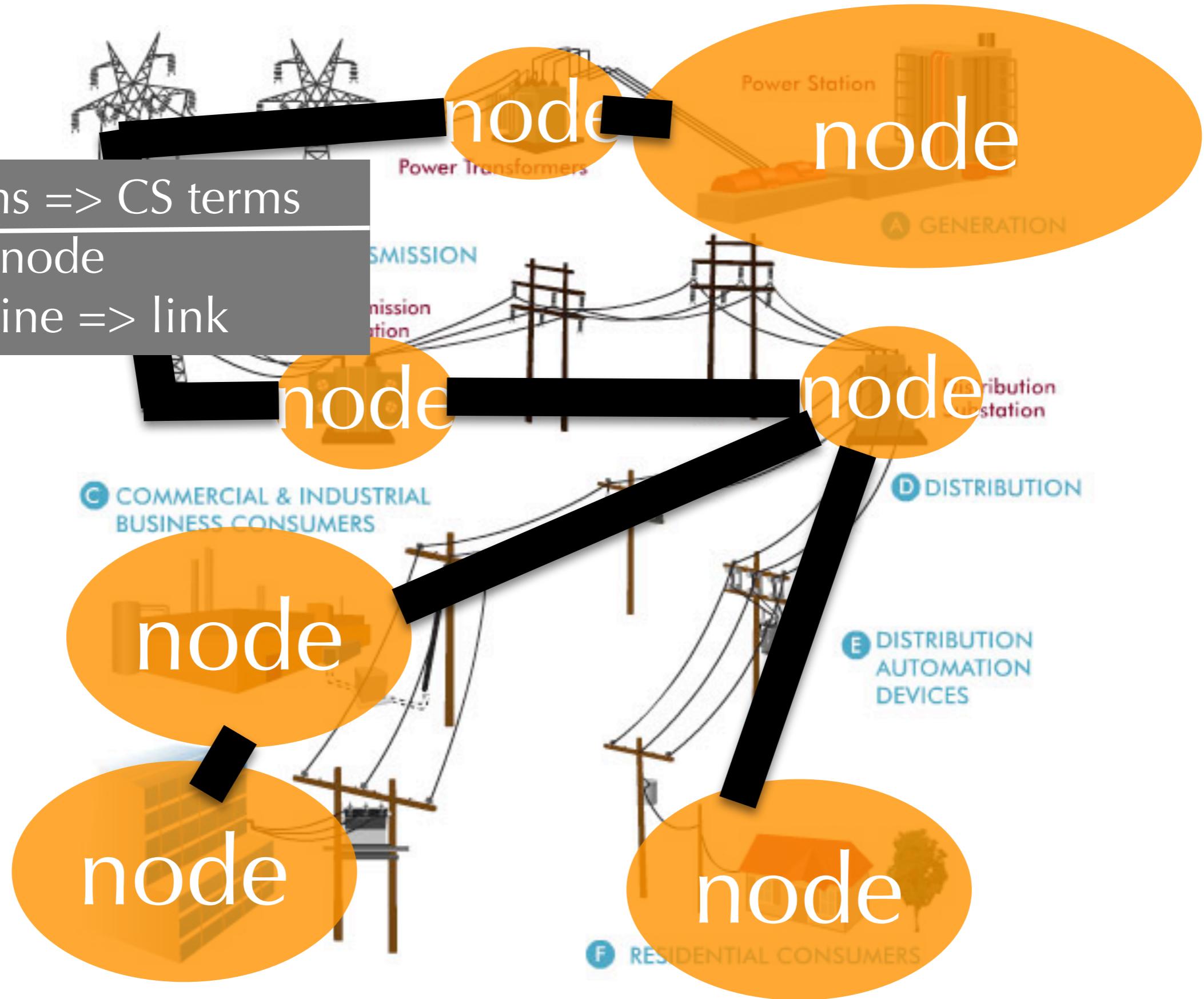
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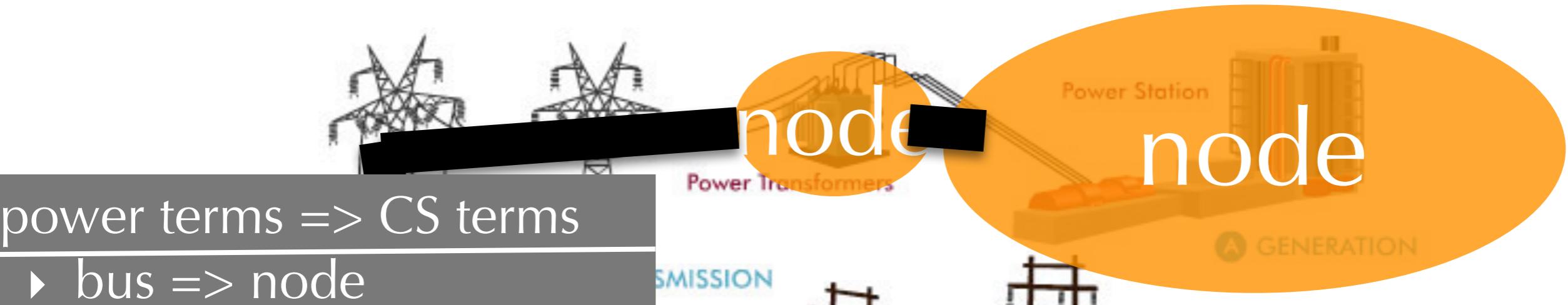
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power terms => CS terms

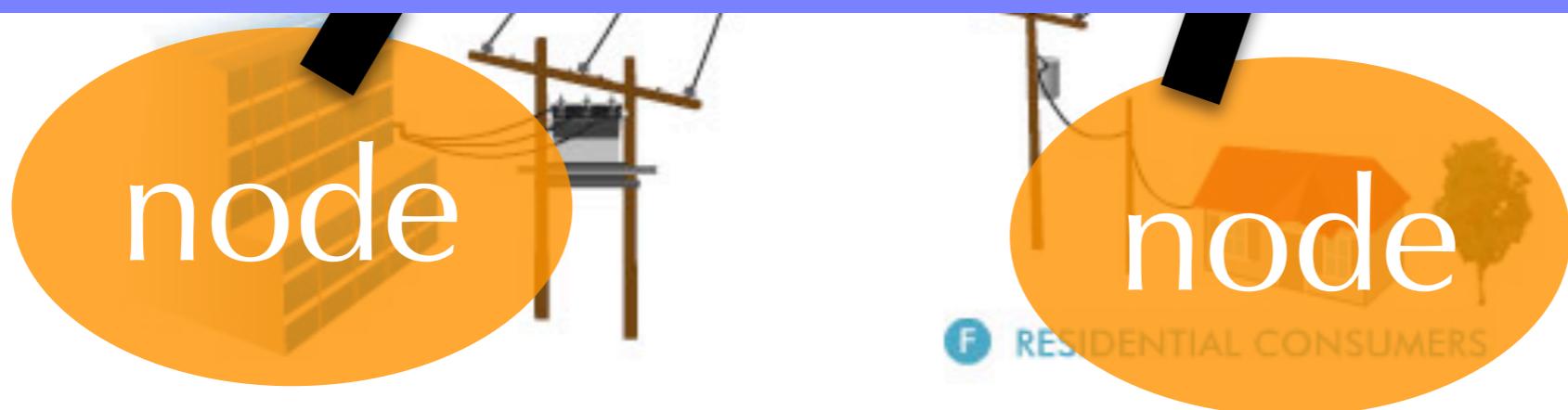
- ▶ bus => node
- ▶ power line => link



# Refresher: Power Grid Definition



major plan for smart grid is to deploy PMU sensors (at nodes) + wide-area communication to better manage and operate the grid



# More on PMU Sensors



- deployed at nodes (buses)
- measure voltage and current of bus (node) and connected transmission lines (links)
  - ▶ high sampling rate (60 samples/sec)
  - ▶ measurements synchronized with GPS clock

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PMUs: instantaneous snapshot of grid of health

# Grid Measurement + Monitoring

where to place PMUs to maximize observability?

D. Brueni and L. Heath. The PMU Placement Problem. SIAM Journal on Discrete Math, 2005

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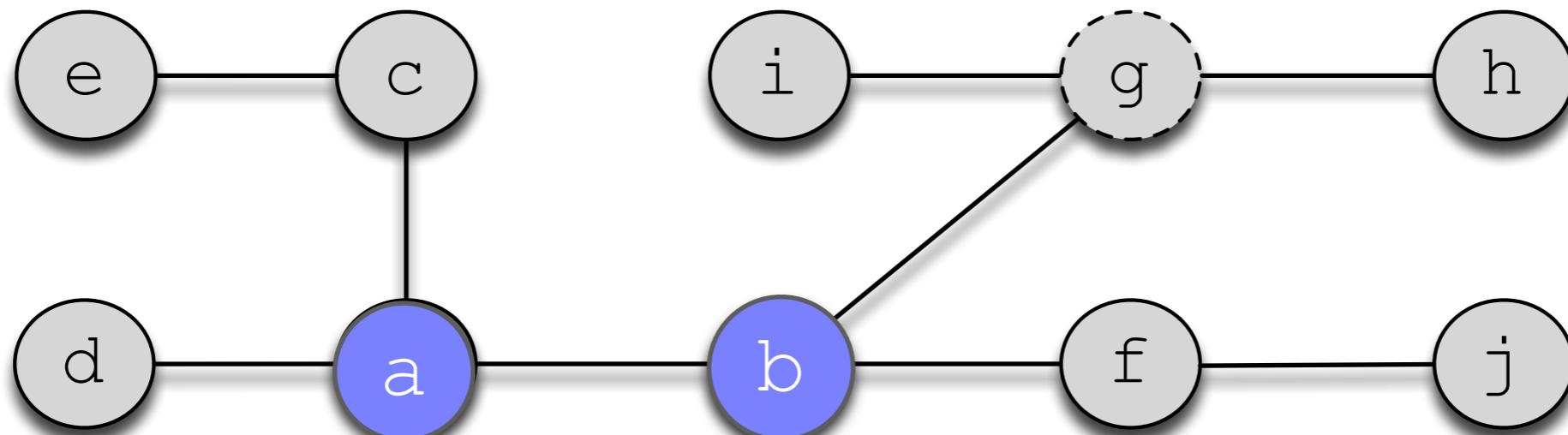
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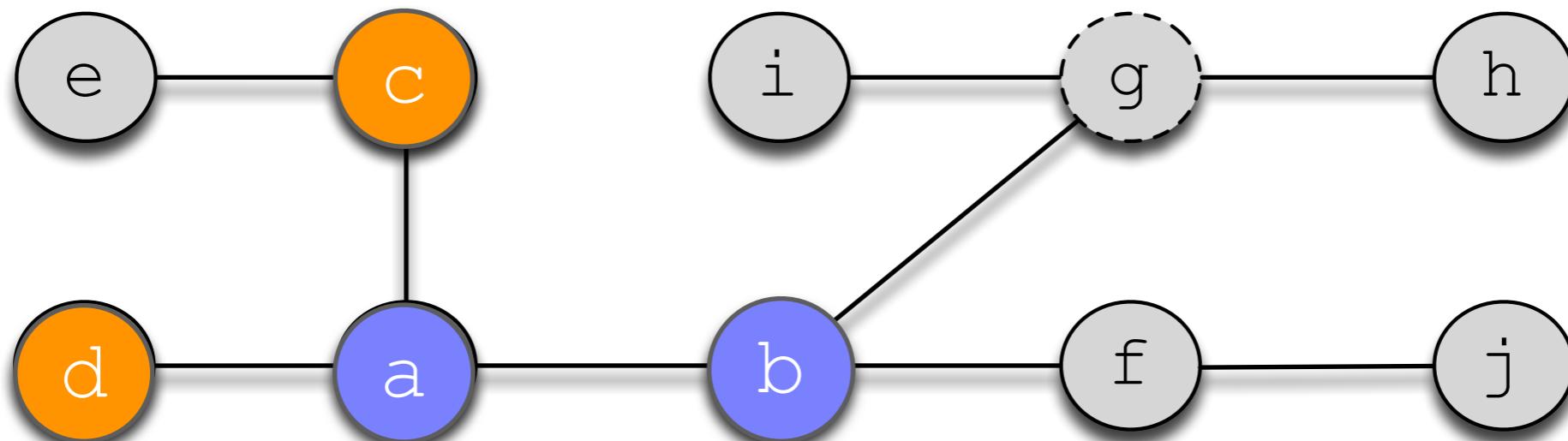


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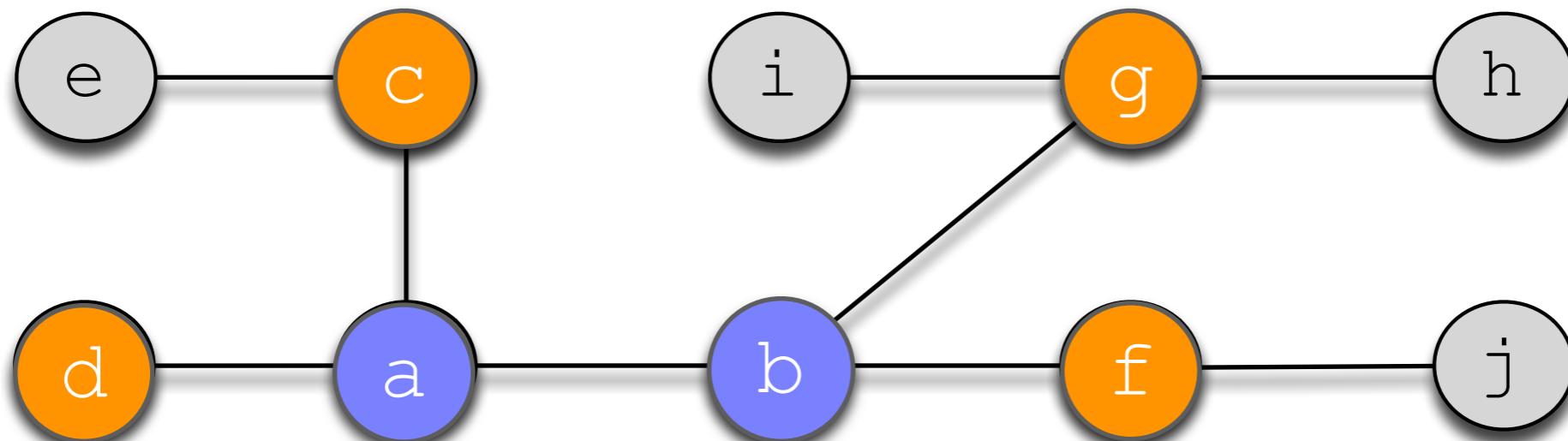


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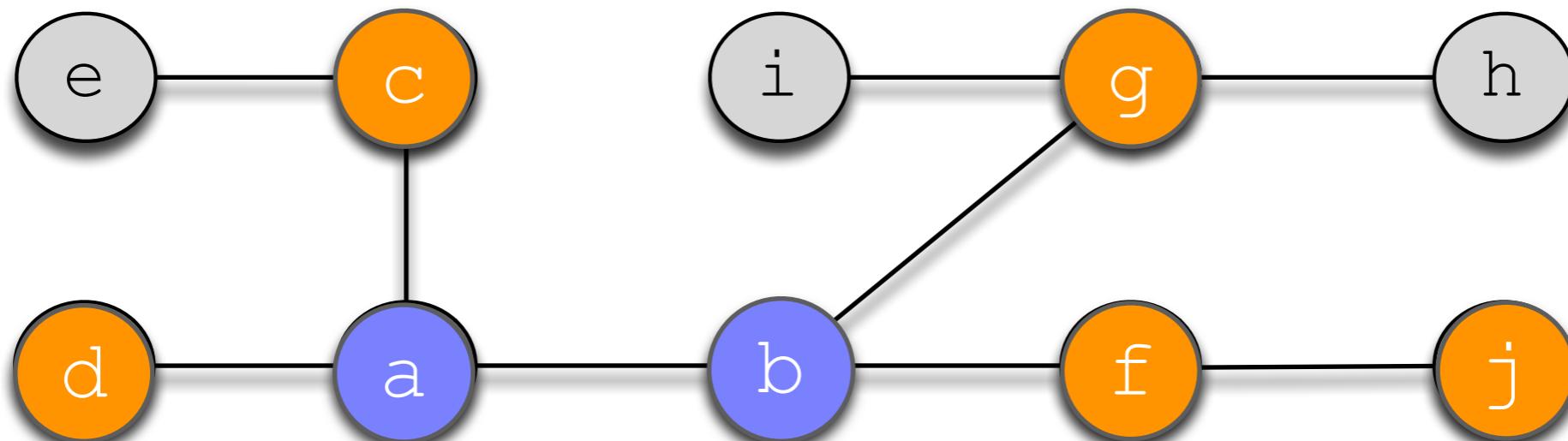


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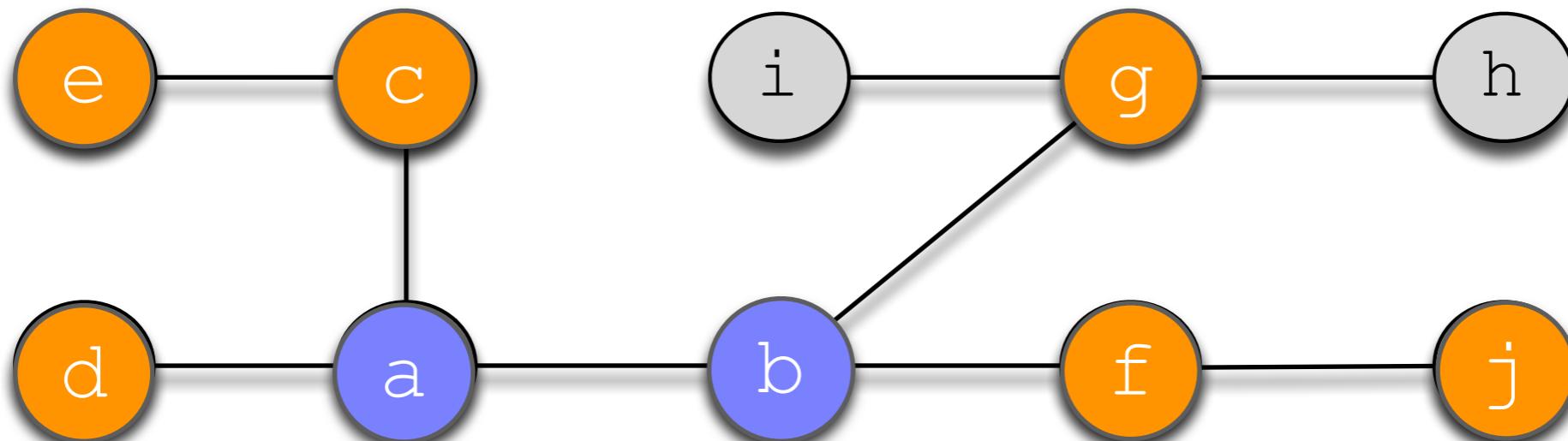


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# MAX-OBSERVE Problem

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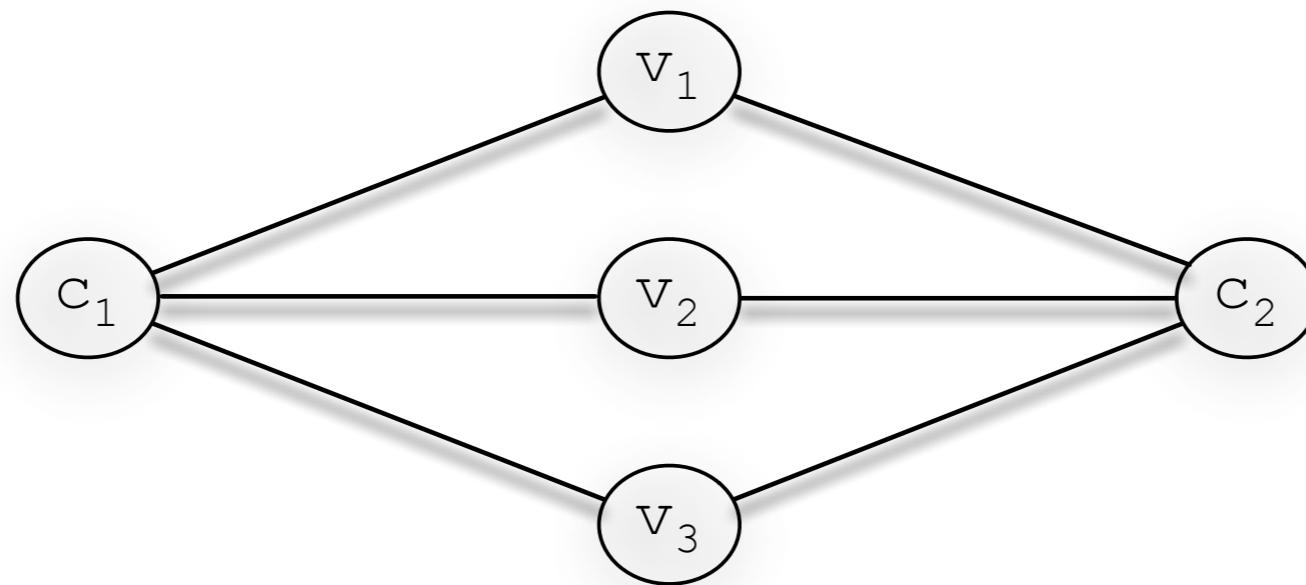
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MAX-OBSERVE is NP-Complete, reduce from planar 3SAT

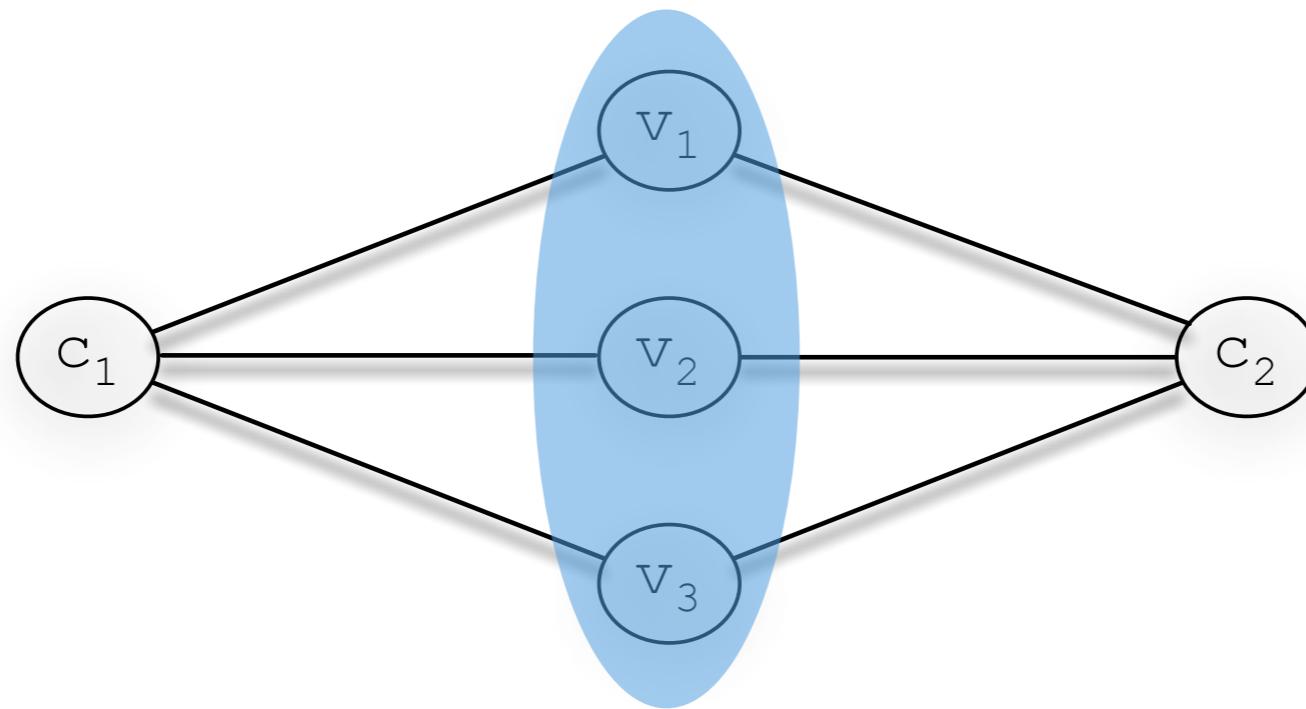
# Proof: MaxObserve is NPC

$$\phi = (\overline{v_1} \vee v_2 \vee v_3) \wedge (v_1 \vee \overline{v_2} \vee \overline{v_3})$$



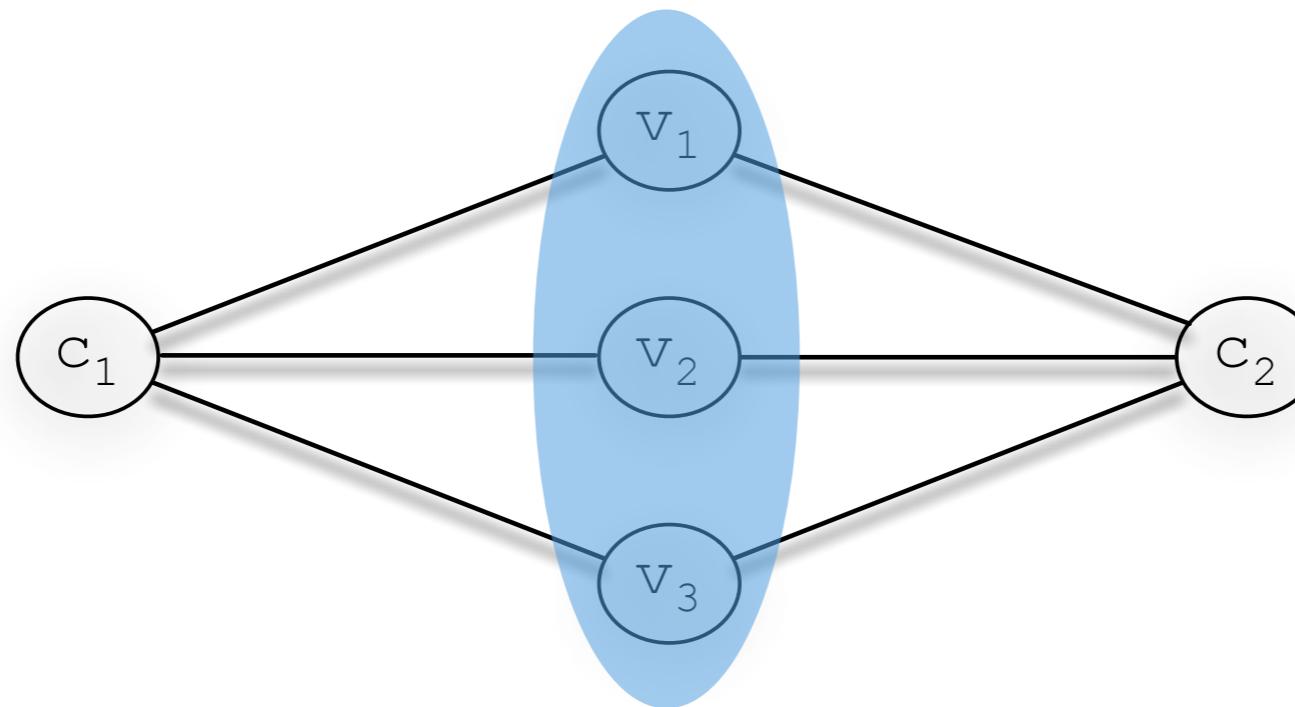
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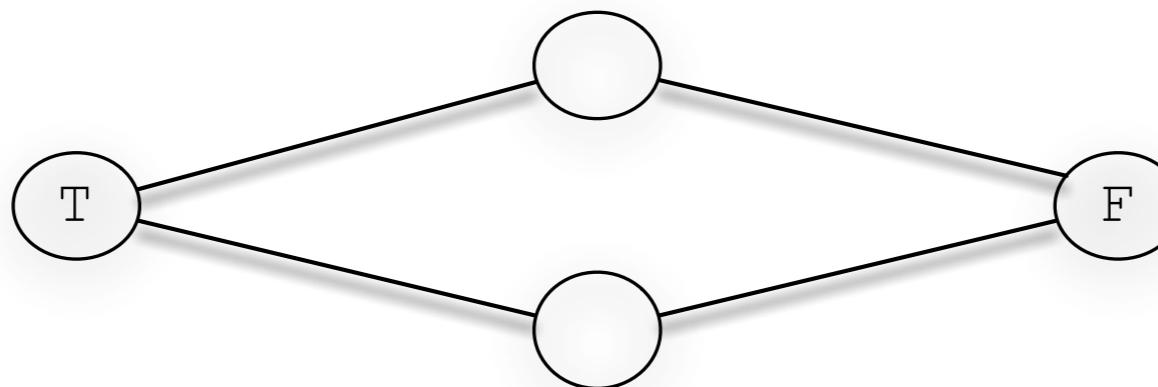


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replace each variable with  
set of nodes below (gadget)



# MAX-OBSERVE Related Work

- we adapt proof technique from Brueni and Heath [13]
- previous work makes unrealistic assumptions  
Brueni and Heath [13], Aazami and Stilp, [4]
  - ▶ assume all nodes are zero-injection
    - in practice: ~5% of nodes are zero-injection

# PMU Placement w/ Cross-Validation

where to place PMUs to maximize observability with requirement that all PMUs are cross-validated?

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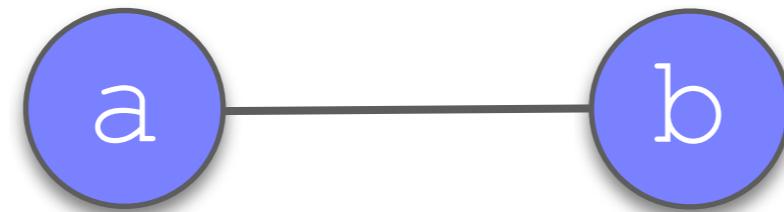
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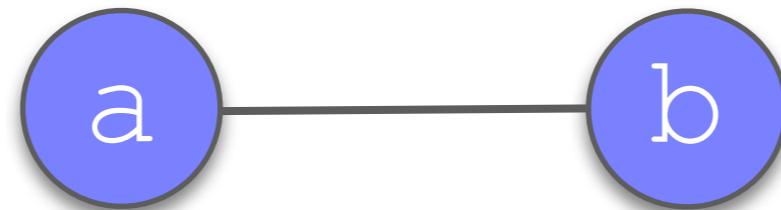
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- cross-validation provides measurement error detection
- cross-validation rule 1: if PMUs are placed at adjacent nodes, they cross-validate each other



- cross-validation rule 2: if two PMUs share a common neighbor, they cross-validate each other



# MAX-OBSERVE-XV Problem

- Input:  $G = (V, E)$  and  $k$  PMUs
- Output: placement of  $k$  PMUs to maximize number of observed nodes, requiring that all PMUs are cross-validated

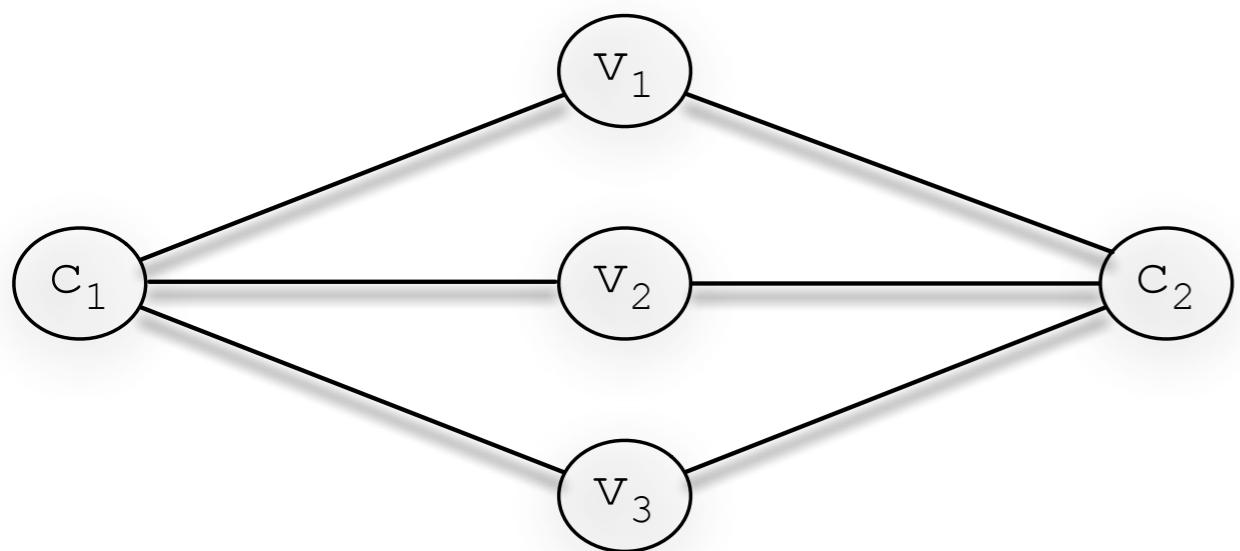
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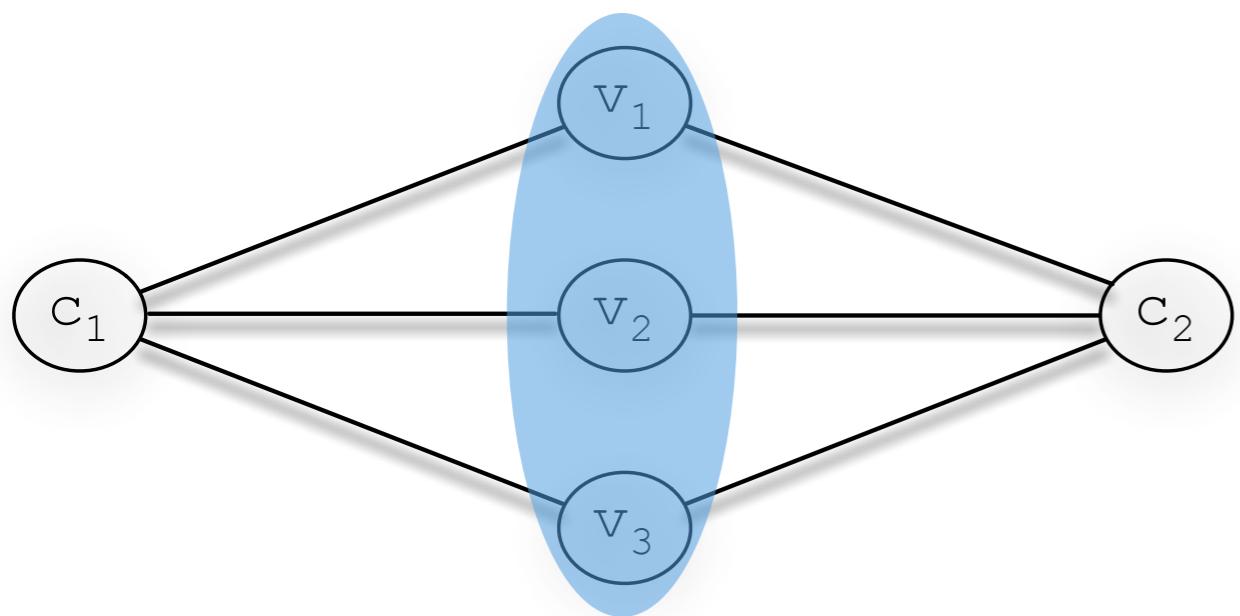
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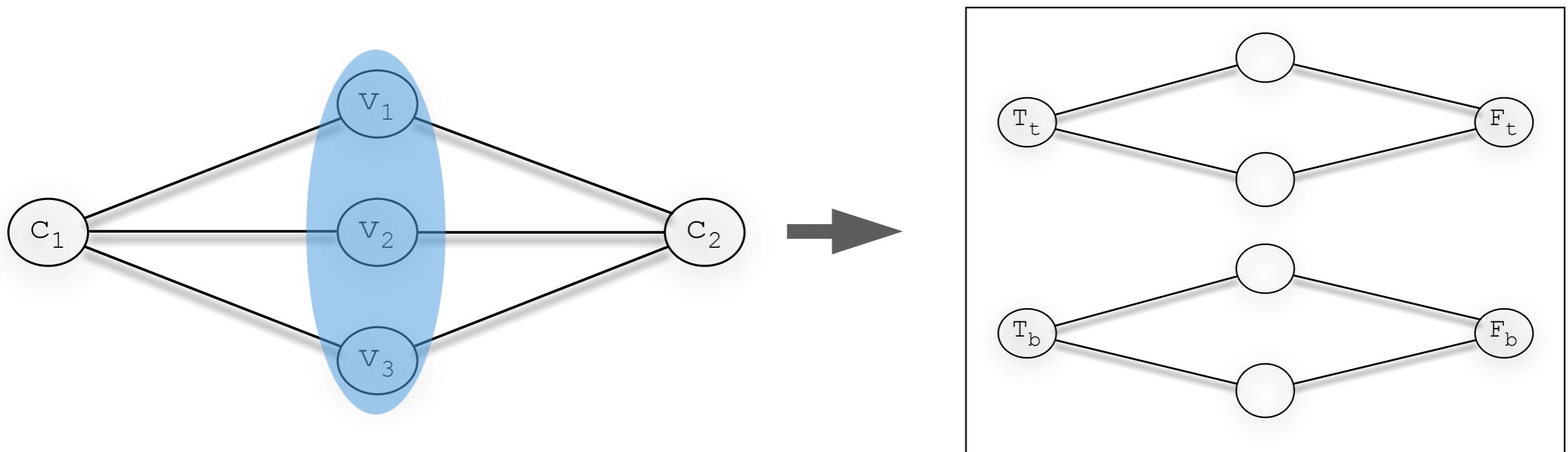
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replace each variable with  
set of nodes (gadget)

# MAX-OBSERVE-XV Related Work

- MAX-OBSERVE-XV is completely new problem
  - ▶ related problem: Chen and Abur [46] add PMUs so PMU loss can be tolerated

# Greedy Approximations

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## GREEDY-XV:

- ▶ iteratively place PMU pairs at nodes  $\{ u, v \}$  such that  $u$  and  $v$  are cross-validated and results in the observation of max # of nodes

# Simulations

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  - ▶ how do greedy approximations compare with brute-force-optimal results?

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  - ▶ how do greedy approximations compare with brute-force-optimal results?
  - ▶ what is the (observability) overhead of cross-validation?

# Simulation Setup

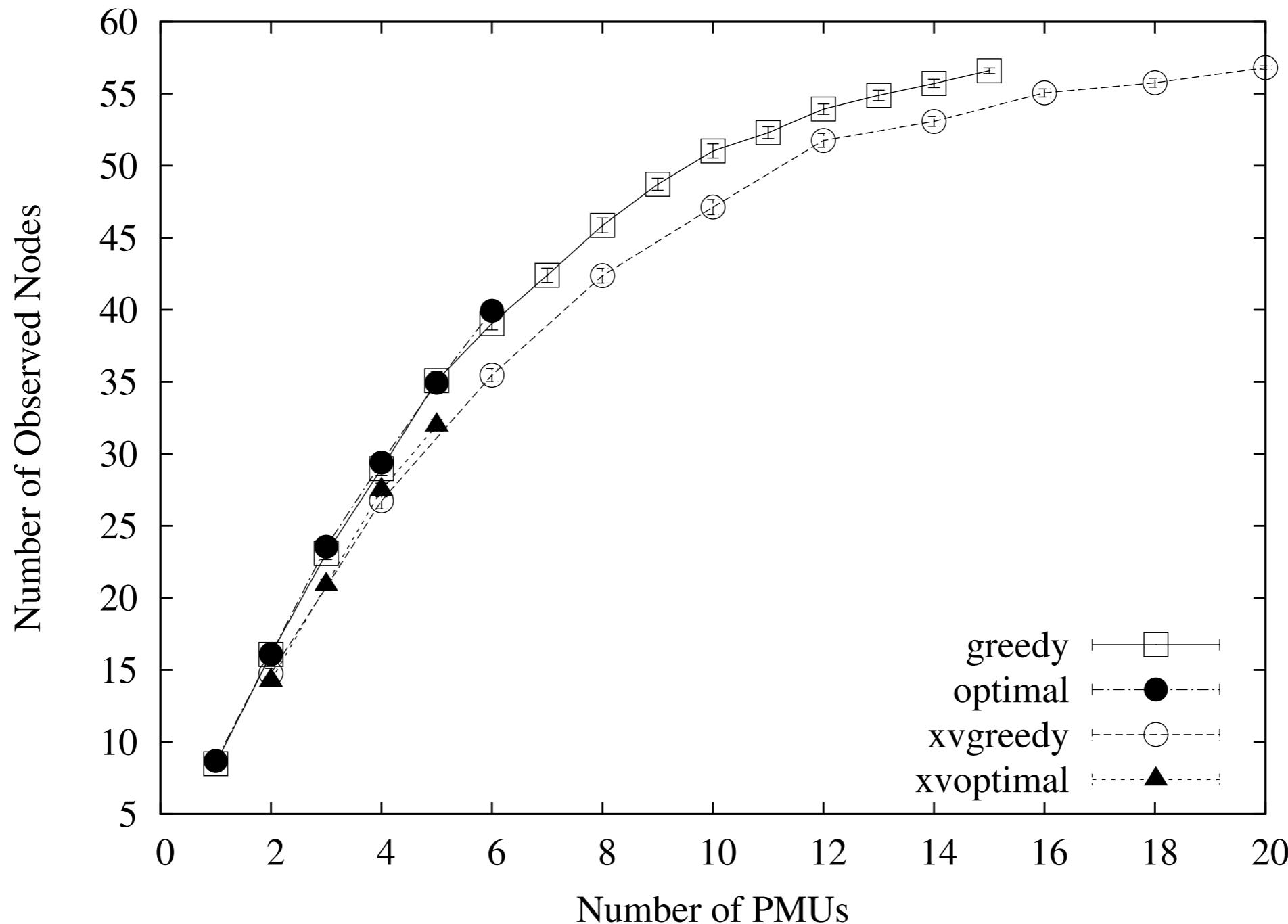
# Simulation Setup

- generate grid networks with same degree distribution as IEEE bus systems
  - ▶ IEEE bus networks: standardized set of graphs used in power systems literature
  - ▶ show results for synthetic topologies based on IEEE Bus 57

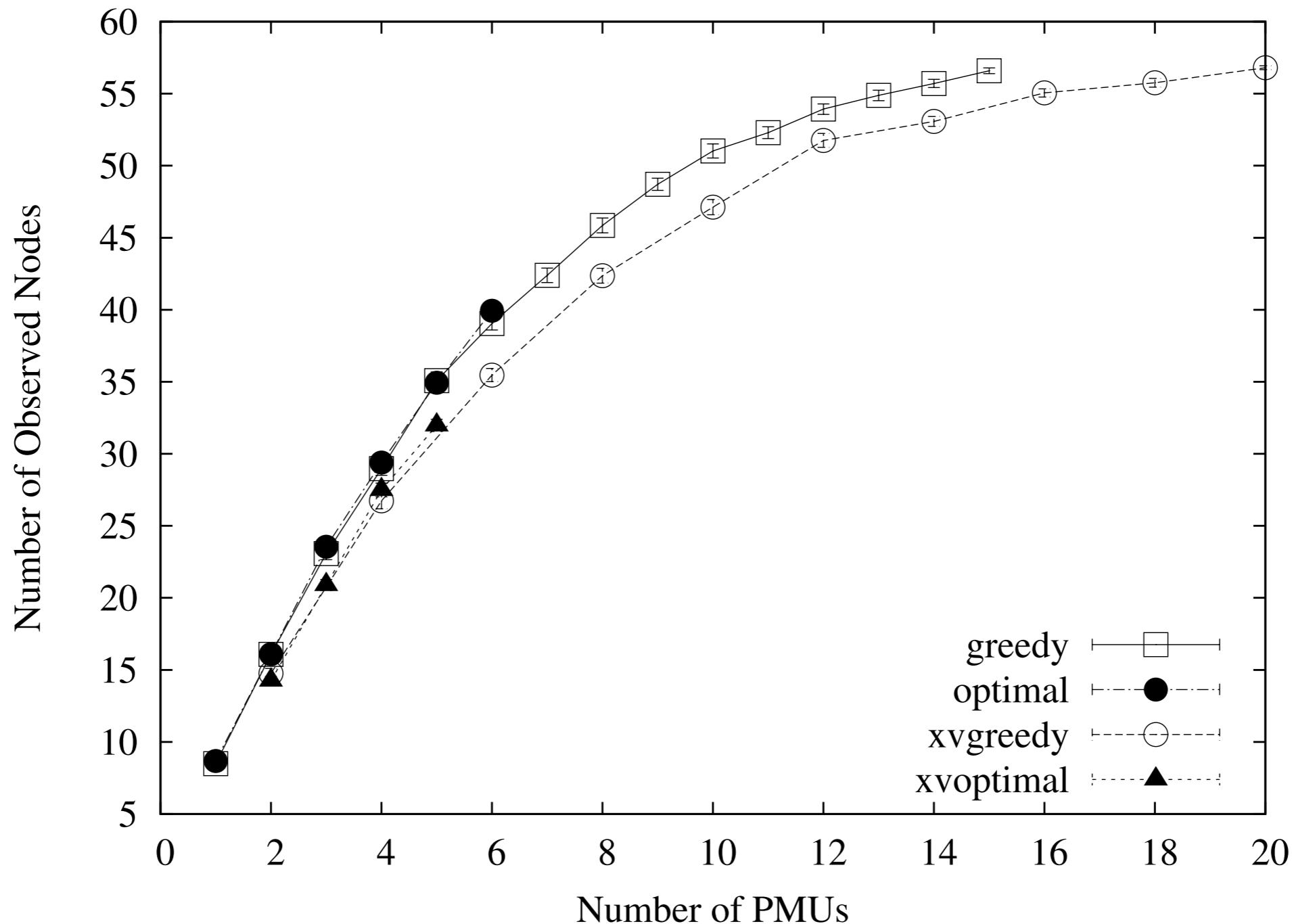
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- generate grid networks with same degree distribution as IEEE bus systems
  - ▶ IEEE bus networks: standardized set of graphs used in power systems literature
  - ▶ show results for synthetic topologies based on IEEE Bus 57
- compare with brute-force optimal solution by enumeration with small # of PMUs

# Simulation Results

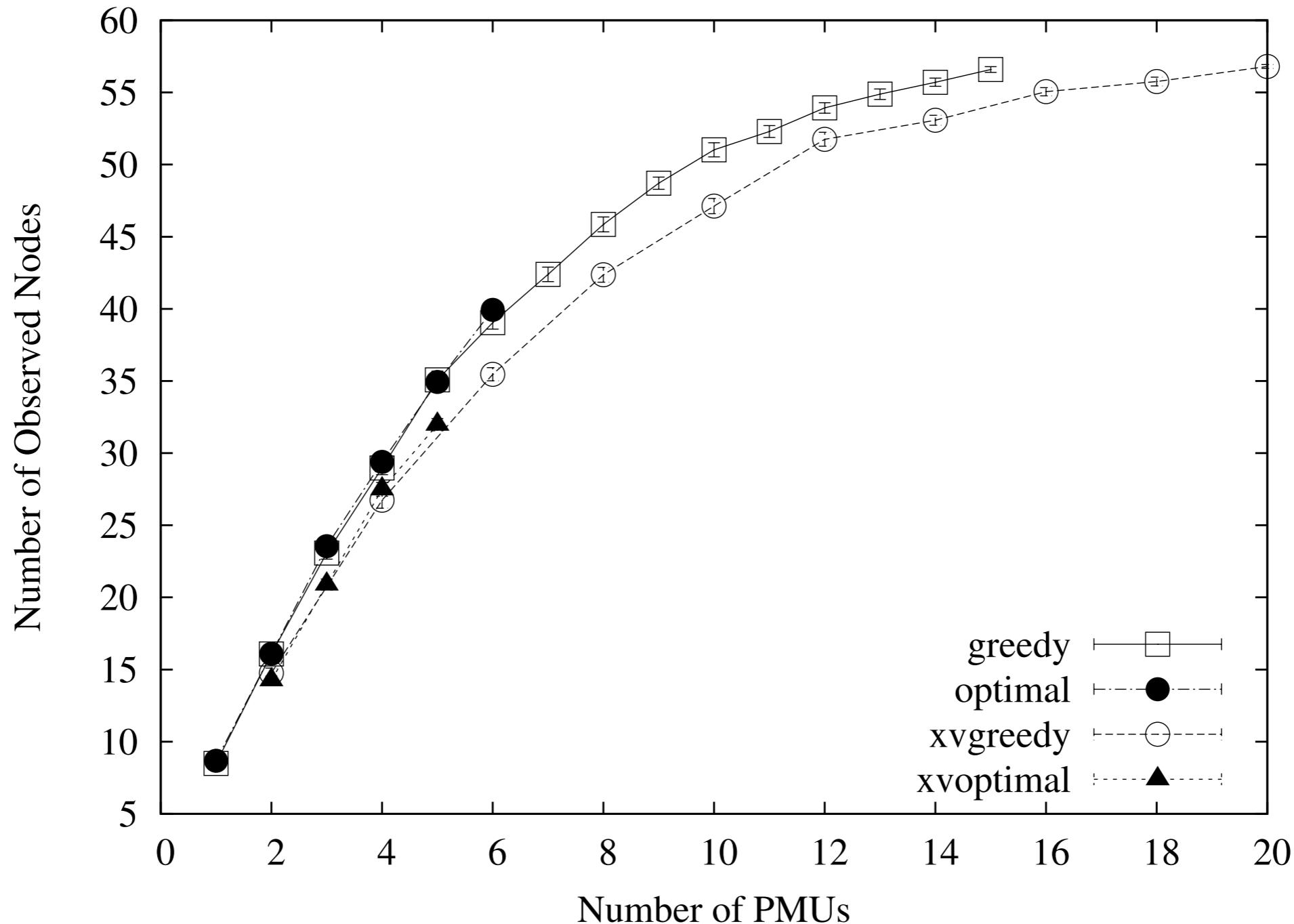


# Simulation Results



result 1: greedy solutions within 97% of optimal

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result 2: cross-validation decreases # observed by ~ 5%

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- recovery from malicious nodes injecting false routing state
- outline for future work and conclusions

# Power Grid Operation

- currently use outdated SCADA system (1960s)
  - ▶ course-grained measurements
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  - ▶ data only locally distributed

current power grid operations inefficient b/c  
large safety buffers required due to lack of  
measurements + poor data dissemination

# Smart Grid Operation

- better sensing
  - ▶ more modern sensors: PMUs, IEDs, ...
  - ▶ fine-grained measurement
- disseminate data widely
  - ▶ utility companies, balancing authorities

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better sensing + wide-area data dissemination  
will enable more efficient ways to operate and  
manage the grid

# Smart Grid Data Dissemination

- richer communication paradigms
  - ▶ QoS guarantees (bandwidth, delay, rate)
  - ▶ multicast delivery (1 to many)
  - ▶ high reliability protocols
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our focus

# Smart Grid Data Dissemination

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our focus

focus on recovery from comm. link failures in smart grid  
=> precompute backup MTs offline in case link fails

# Smart Grid App QoS Requirements

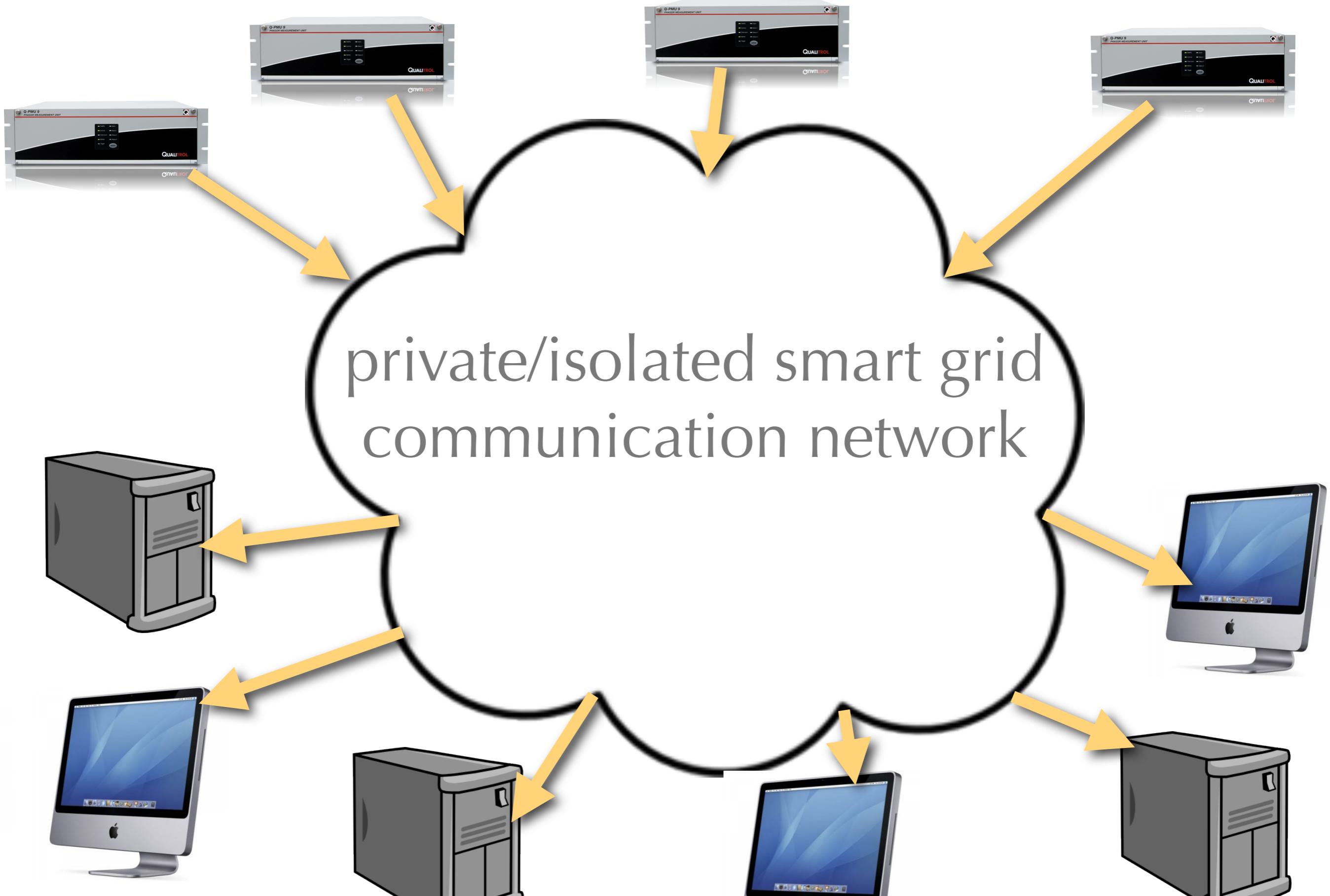
- critical power grid applications have stringent and challenging QoS requirements [7]
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    - 8-16ms per packet delay for real-time control applications [7]
  - ▶ low tolerance for packet loss

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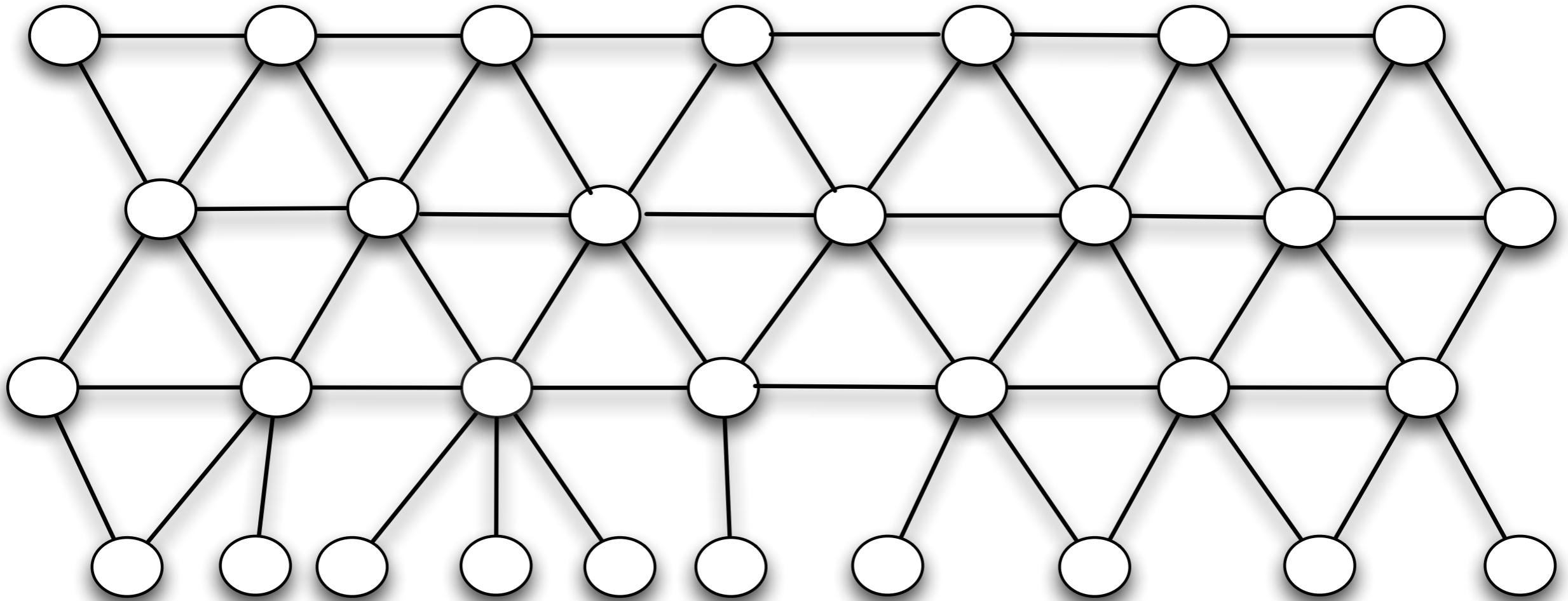
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hard E2E delivery guarantees are needed!

# Smart Grid Communication Network

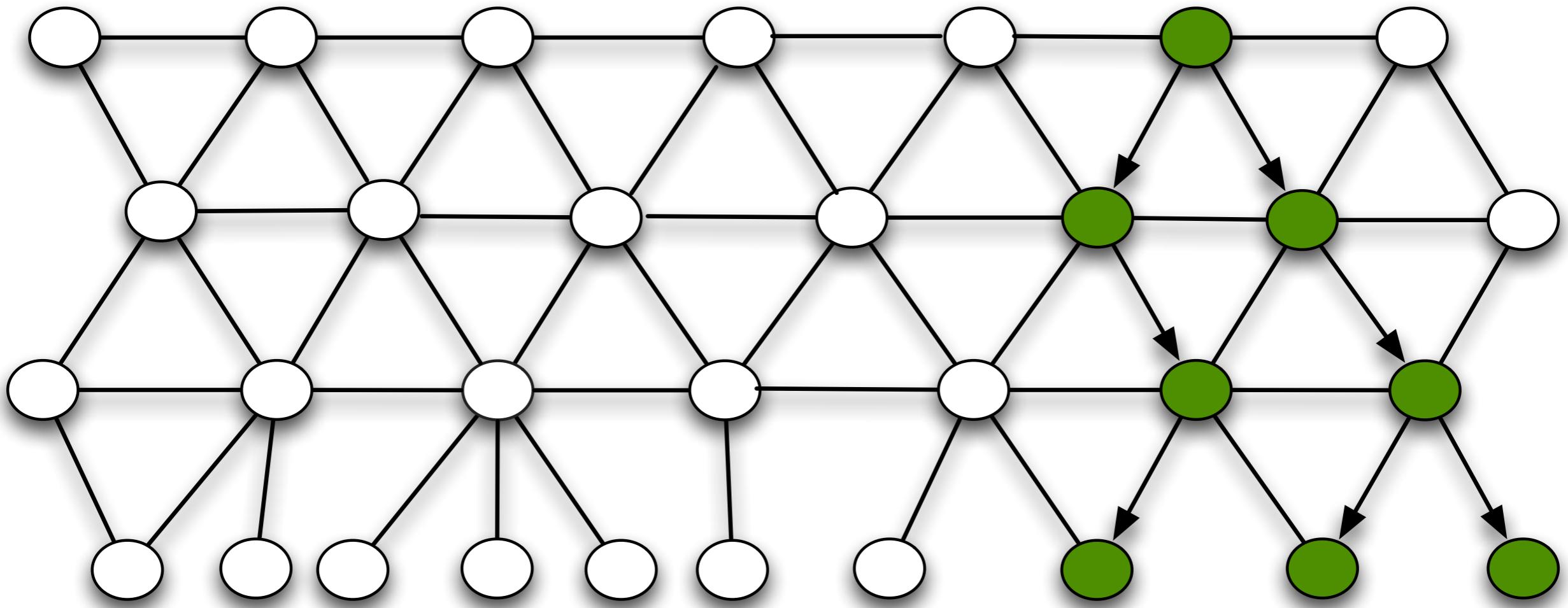


# Problem Description



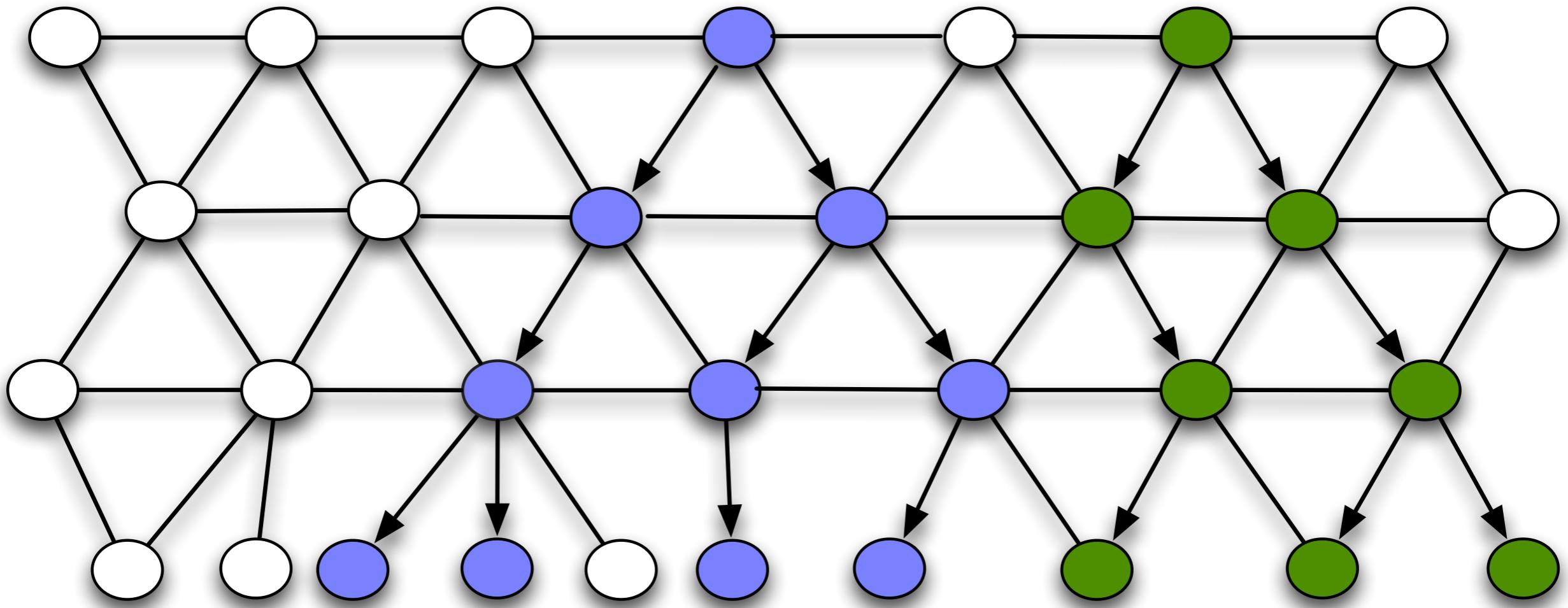
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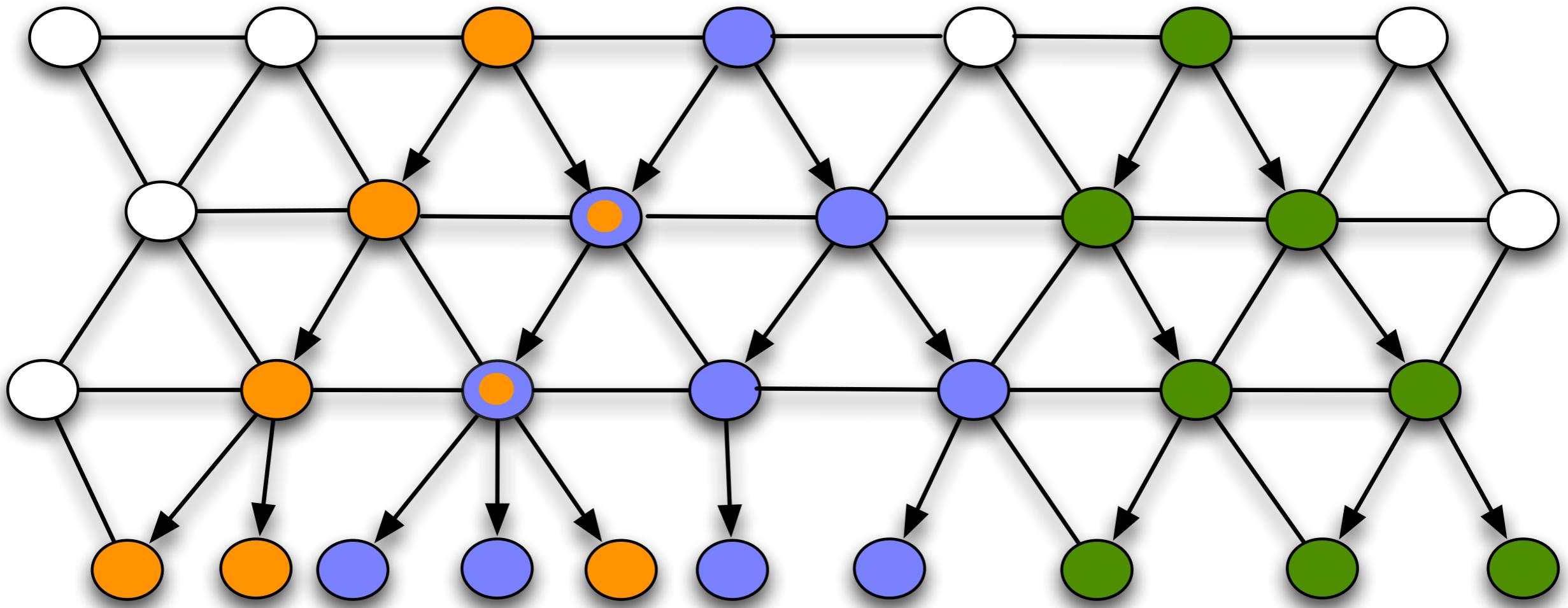
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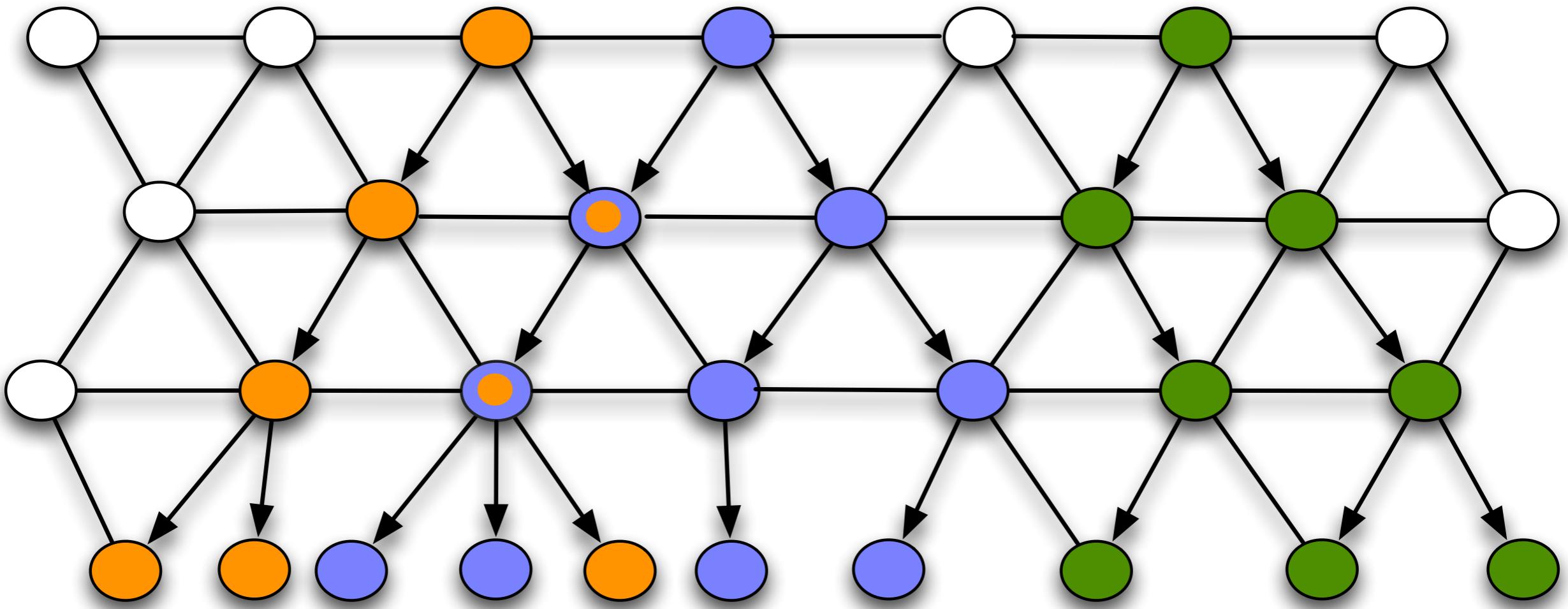
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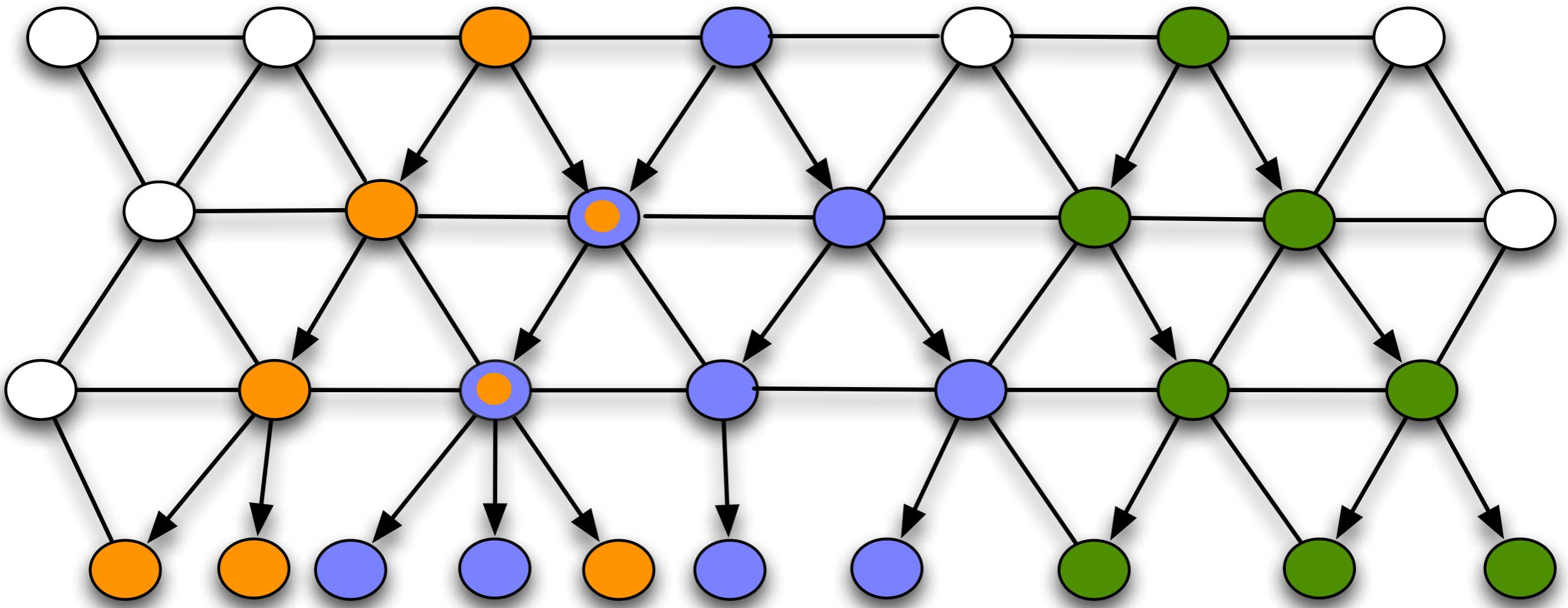
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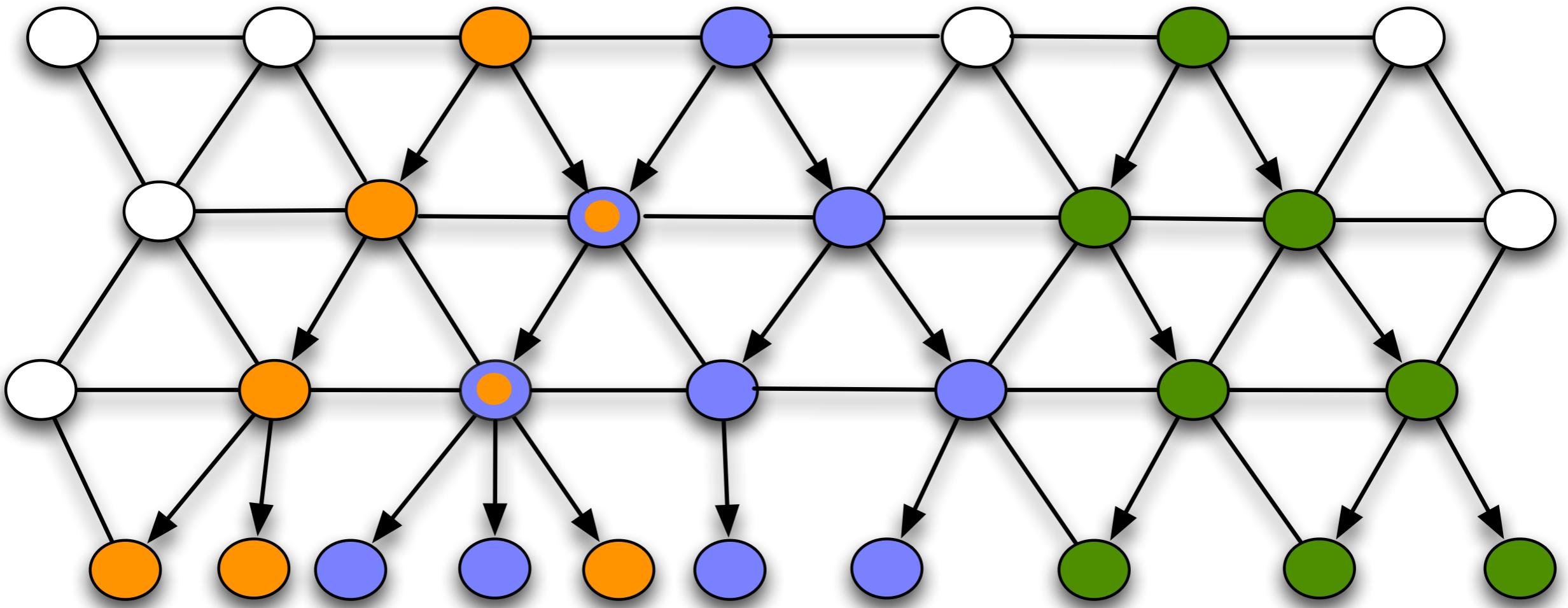
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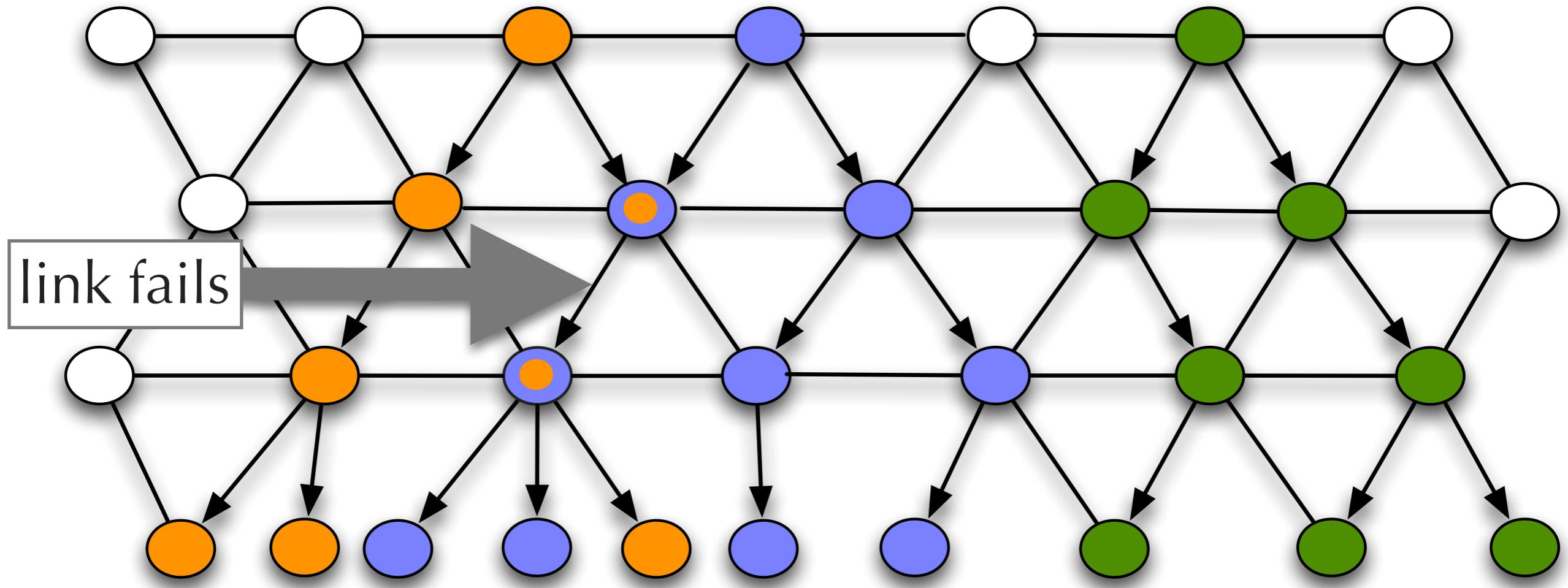
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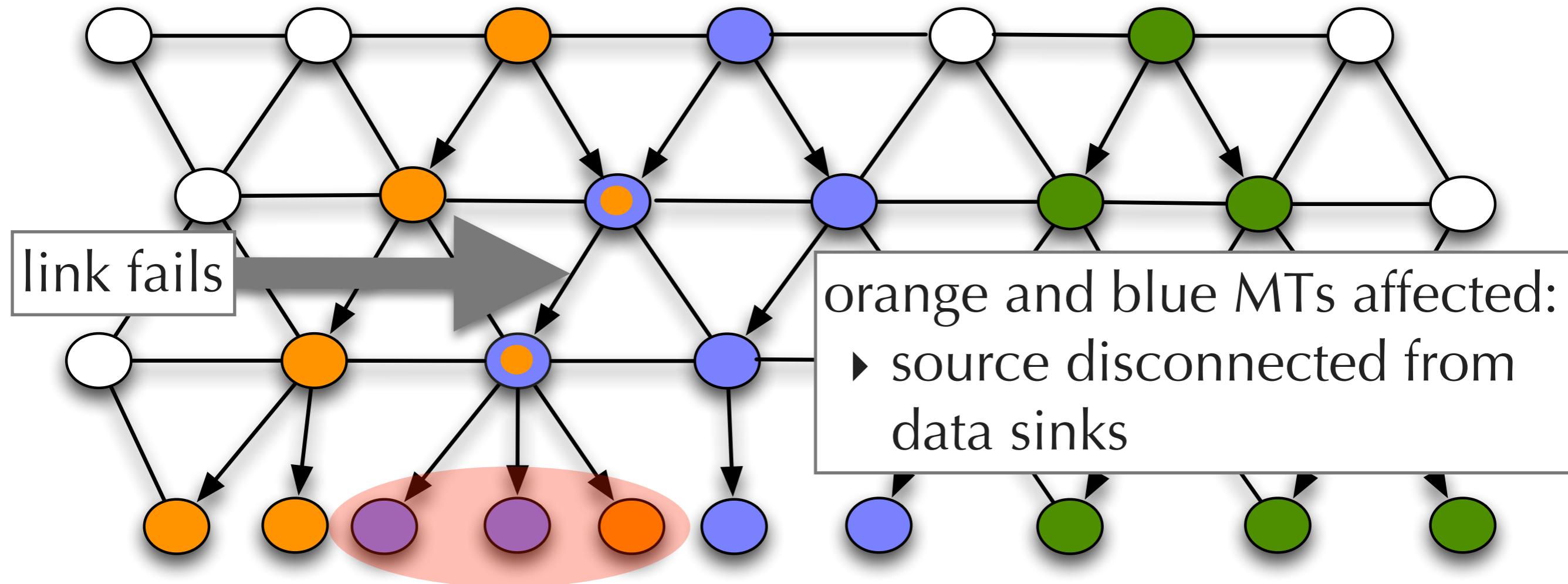
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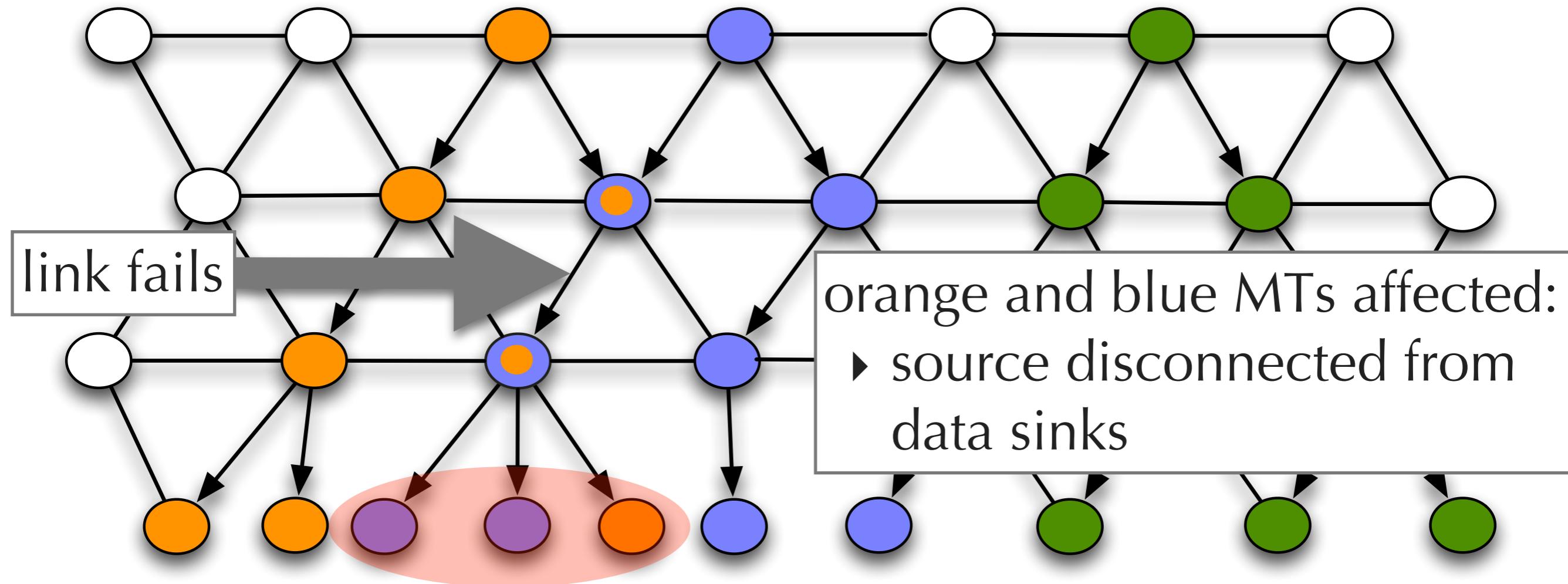
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# Problem Description



how to detect MT link failure + recover such that E2E packet loss and delay is minimized?

- ▶ each (source,sink) pair has LLL per packet delay req.

# 2-Step Solution

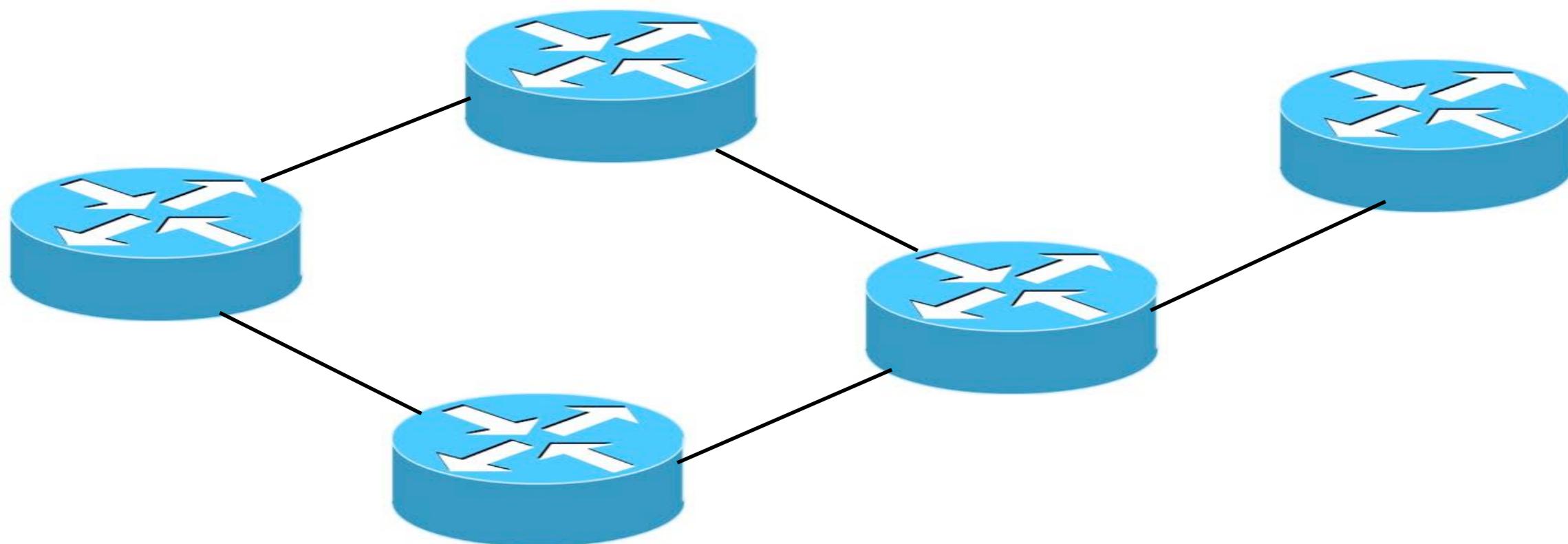
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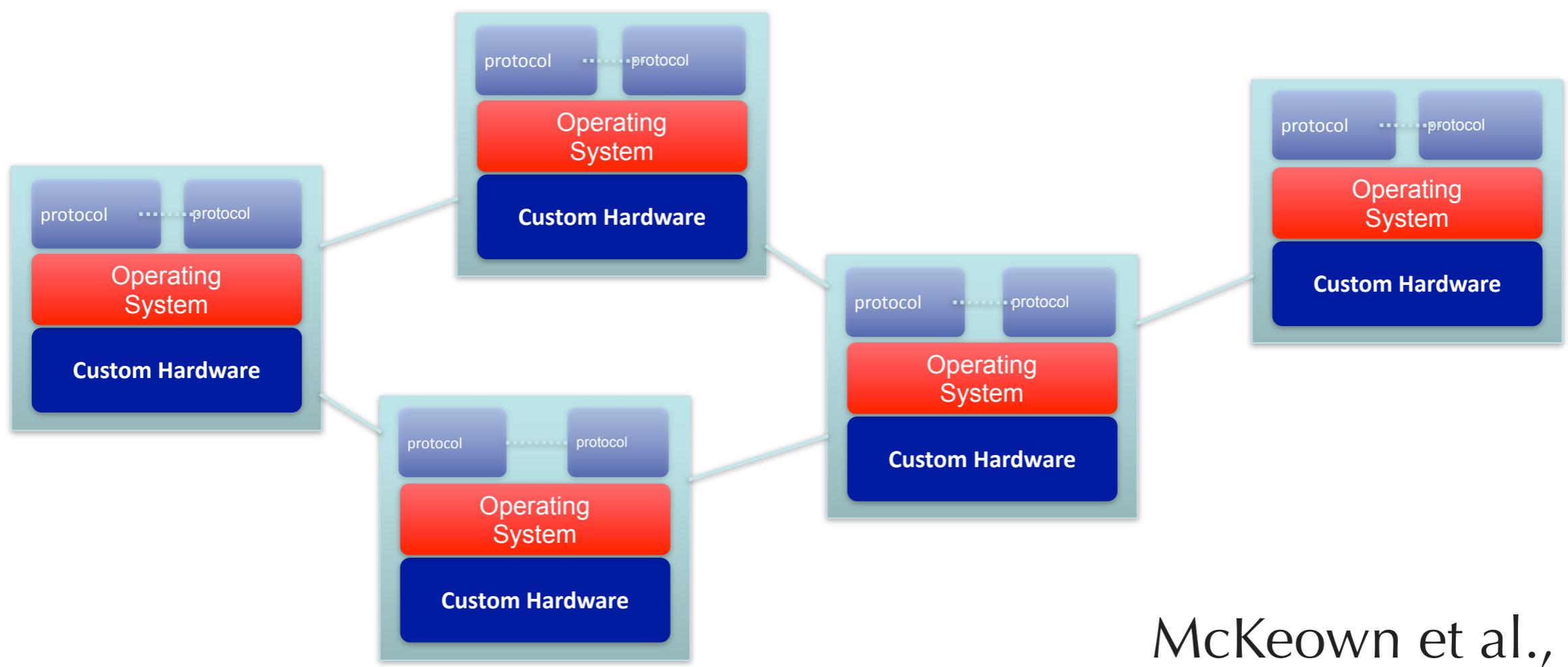
requires changes to existing routers ... how?

# OpenFlow: Open Network Control Plane



McKeown et al., [36]

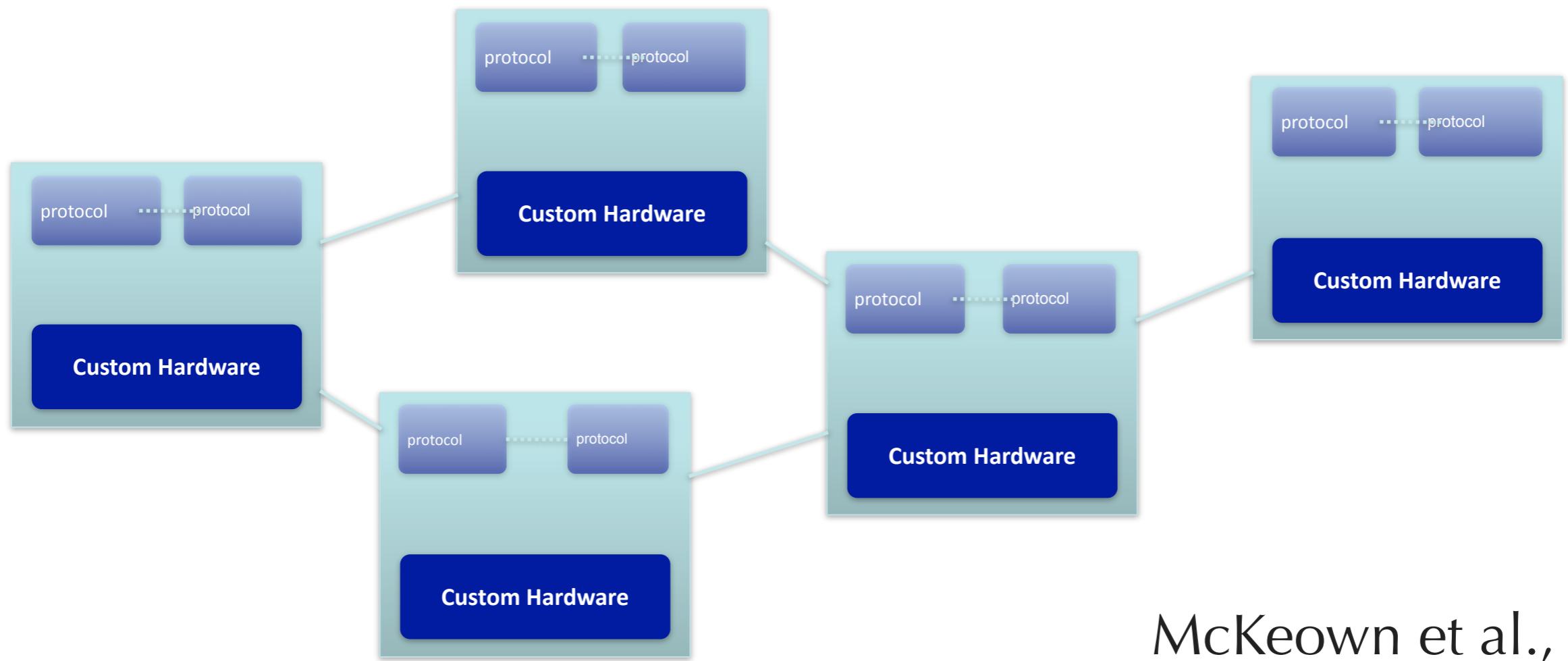
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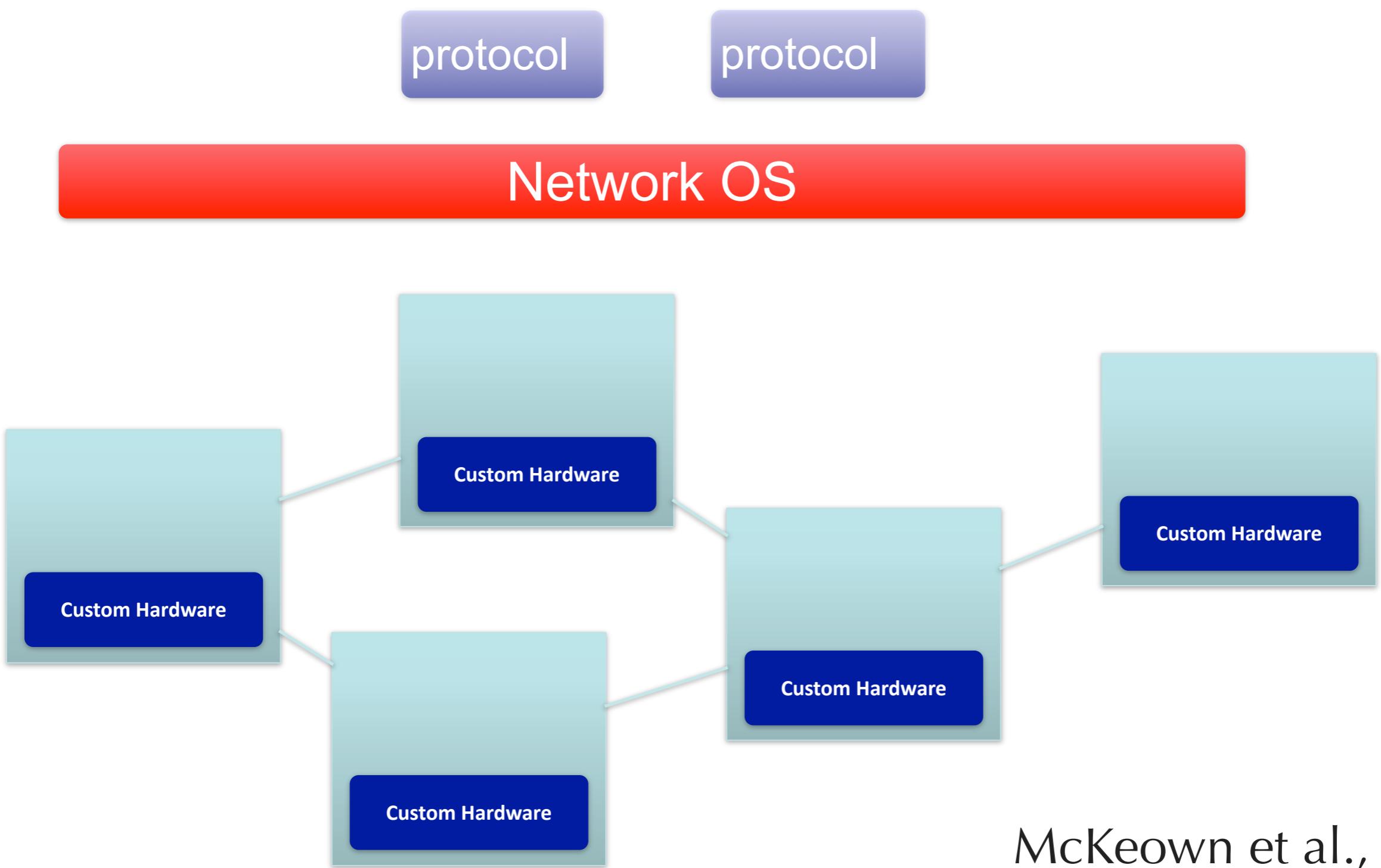
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Network OS



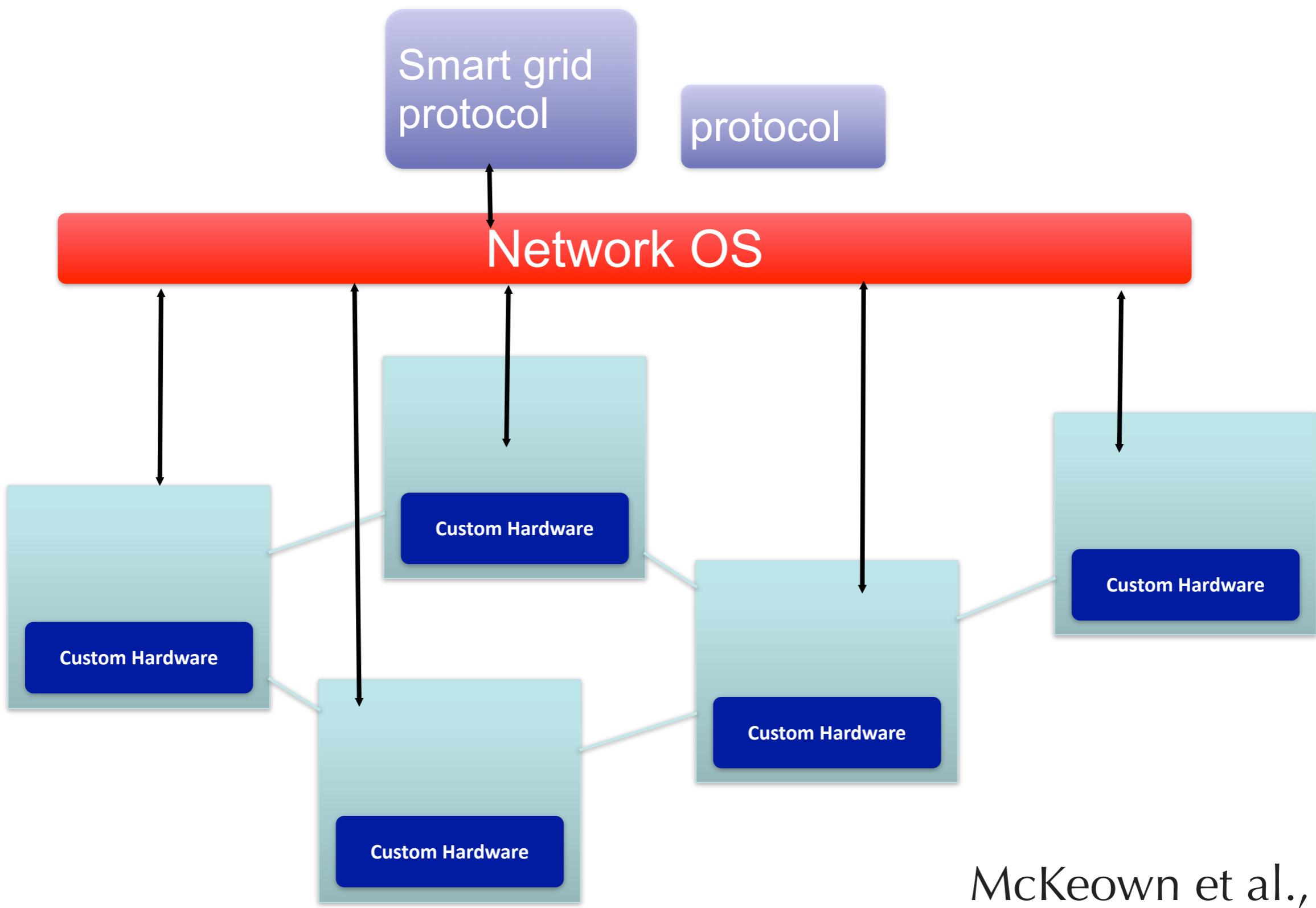
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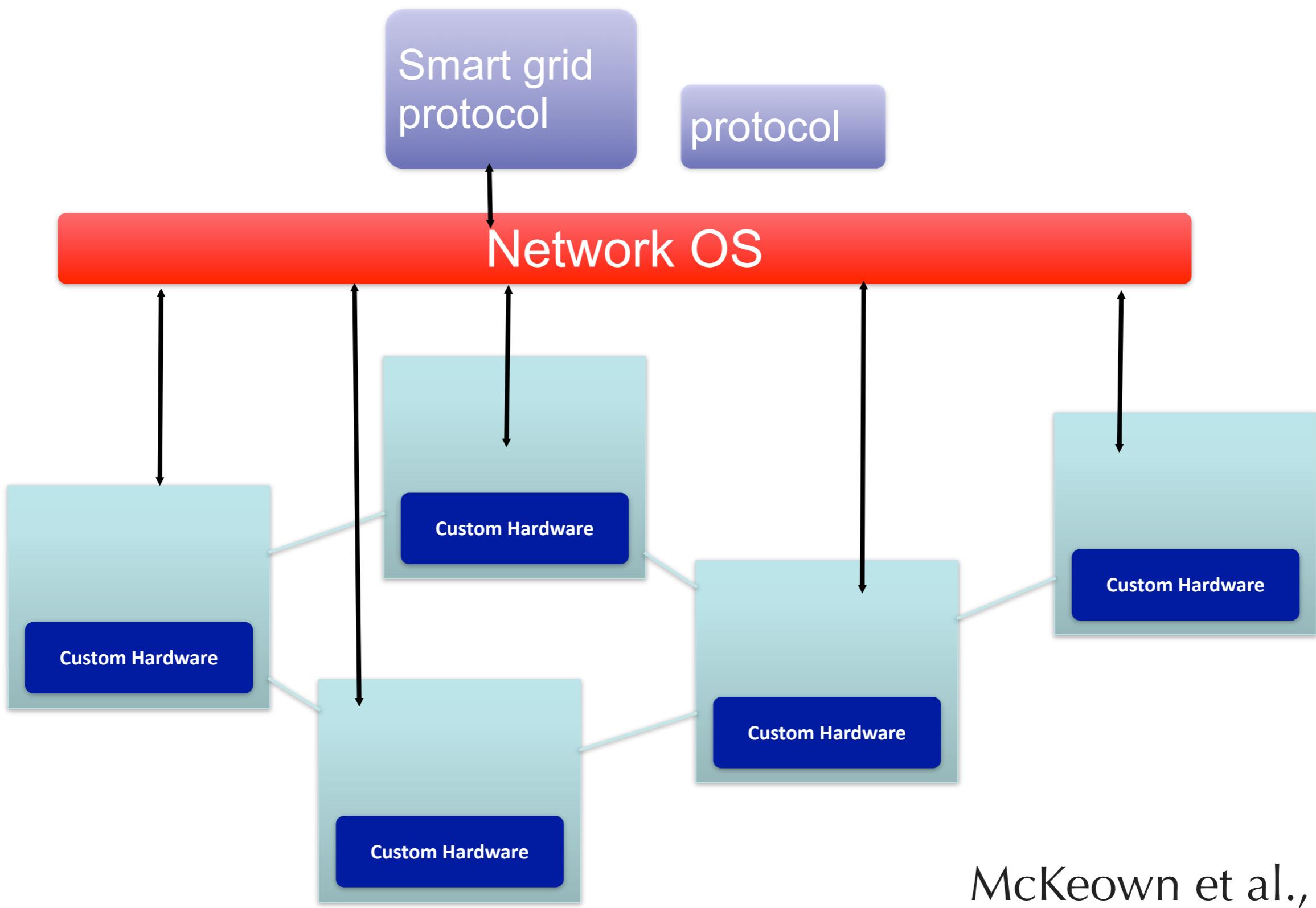
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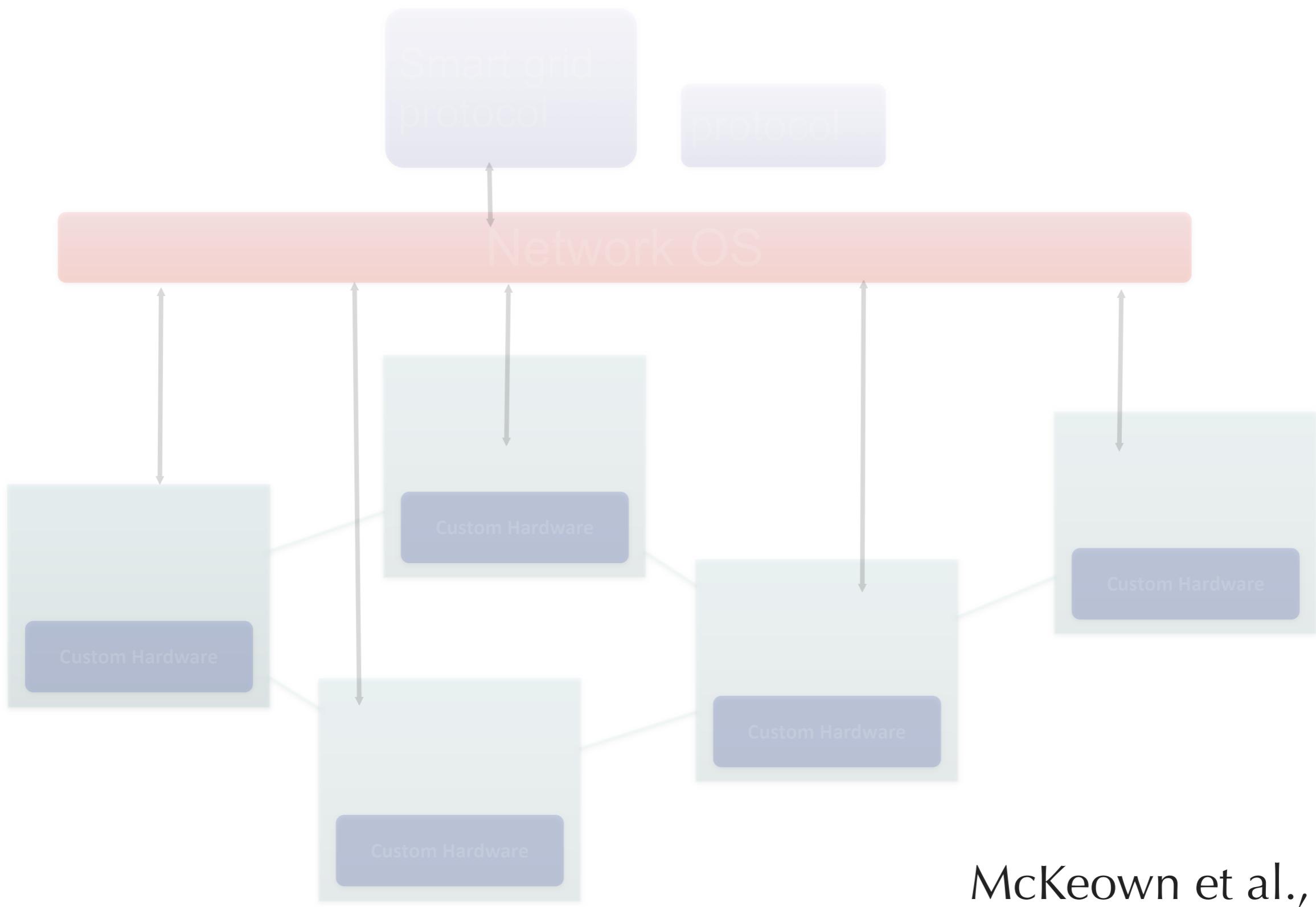
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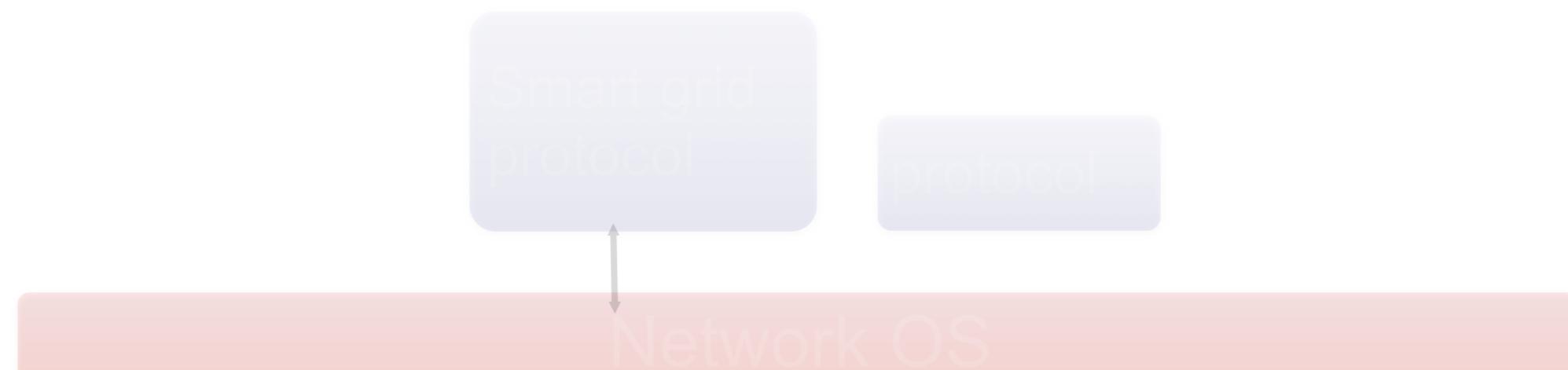
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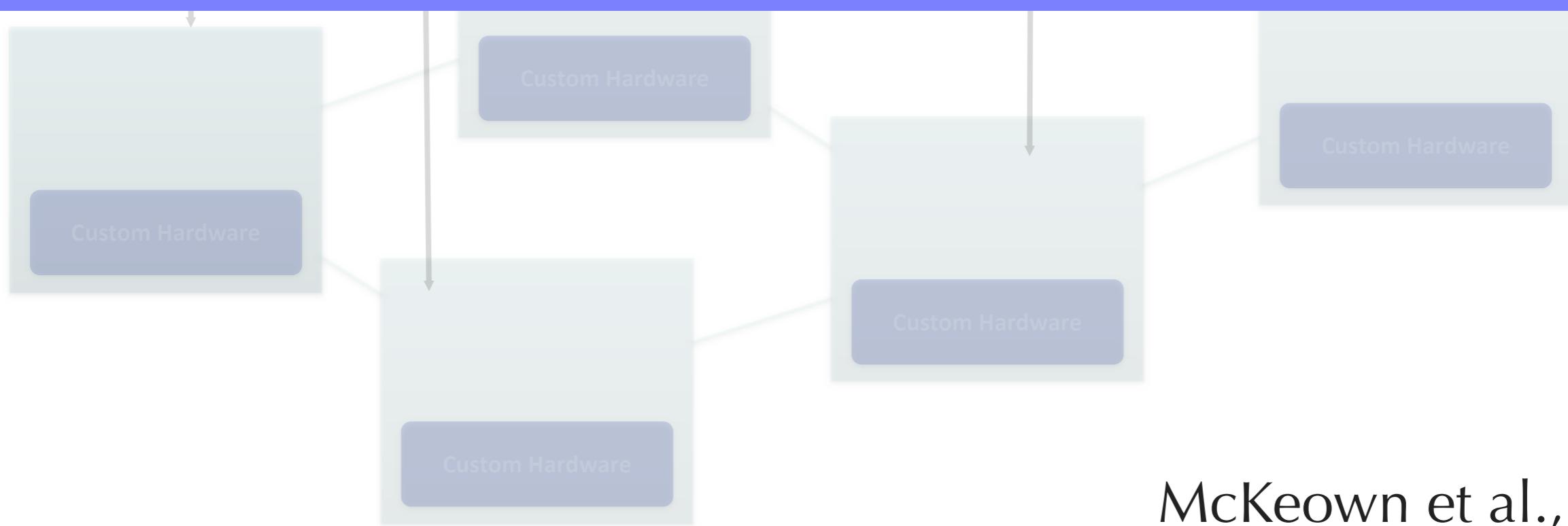


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# OpenFlow: Open Smart Grid Control Plane



we use OpenFlow to implement self-healing multicast protocol designed specifically for grid



McKeown et al., [36]

# Why Develop a New Solution?

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- public Internet:
  - ▶ best-effort model unsuitable to meeting hard E2E delay requirements Bakken et al. [7]
  - ▶ general purpose, not optimized for power grid
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- Gridstat:
  - ▶ pub-sub system proposed by Bakken et al. [7]
  - ▶ does not address link failures

# Why Develop a New Solution?

- MPLS fast reroute ([18, 23, 37, 42, 47]) similar but
  - ▶ typically consider unicast flows
  - ▶ optimization criteria specified over single MT
    - we consider criteria across multiple MTs
    - Li et al. [Infocomm 2006] is an exception
      - ★ minimize total backup path bandwidth reservation across *all* backup paths (across all MTs)

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- leverage OpenFlow native packet counters + ability to tag packets
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- ensure that upstream and downstream switches consider the same set of packets

# Precomputing Backup MTs

- propose 3 Algorithms
  - ▶ MIN-FLOWS, MIN-SINKS, MIN-CONTROL
  - ▶ same input and output (objective function differs)

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Output:

- ▶ a backup MT for each MT using  $l$  (call this set  $T_1$ ) s.t. if all MTs in  $T_1$  were installed:
  - all E2E per-packet delay requirements are met
  - objective function optimized

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MIN-FLOW & MIN-SINK compute backup MTs  
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- MT may have longer paths

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- objective function
  - ▶ set of backup MTs ( $T_1$ ) should be computed s.t. *across all network links and all network flows*, the maximum # of flows traversing a single link is minimized

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global optimization criteria

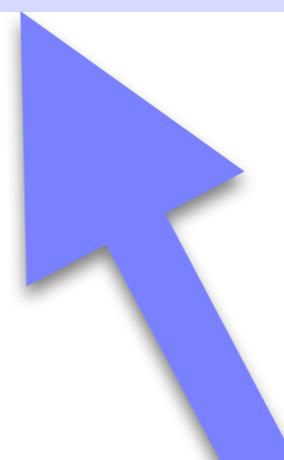
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  - ▶ the set of backup MTs ( $T_1$ ) should be computed s.t. the minimum # of routers need to be signaled to change state

# Research Questions

Q1: How much faster is detecting link failures inside the network than E2E detection?

# Research Questions

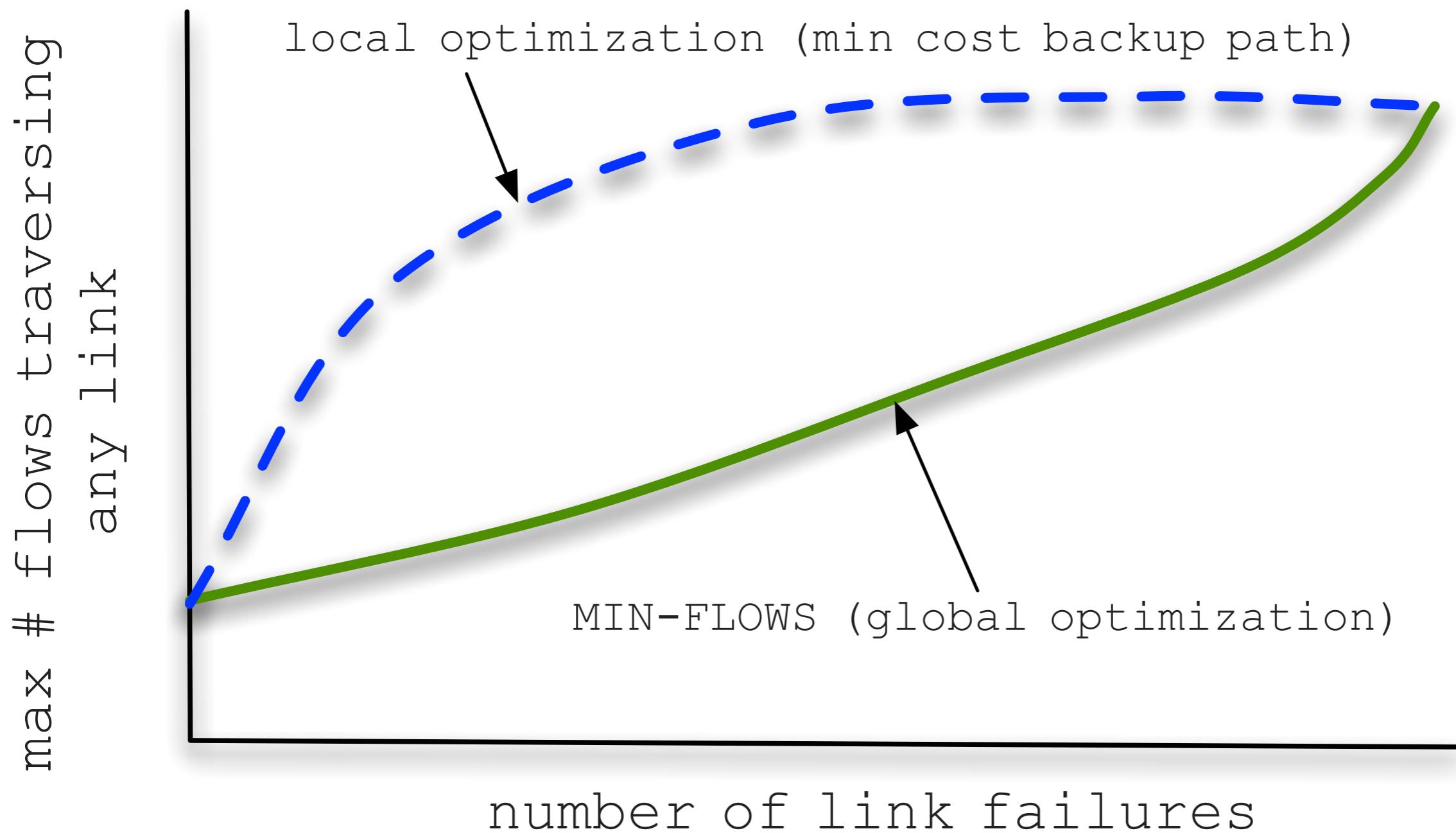
Q2: How to design and implement efficient  
algorithms for MIN-FLOWS, MIN-SINKS, +  
MIN-CONTROL?

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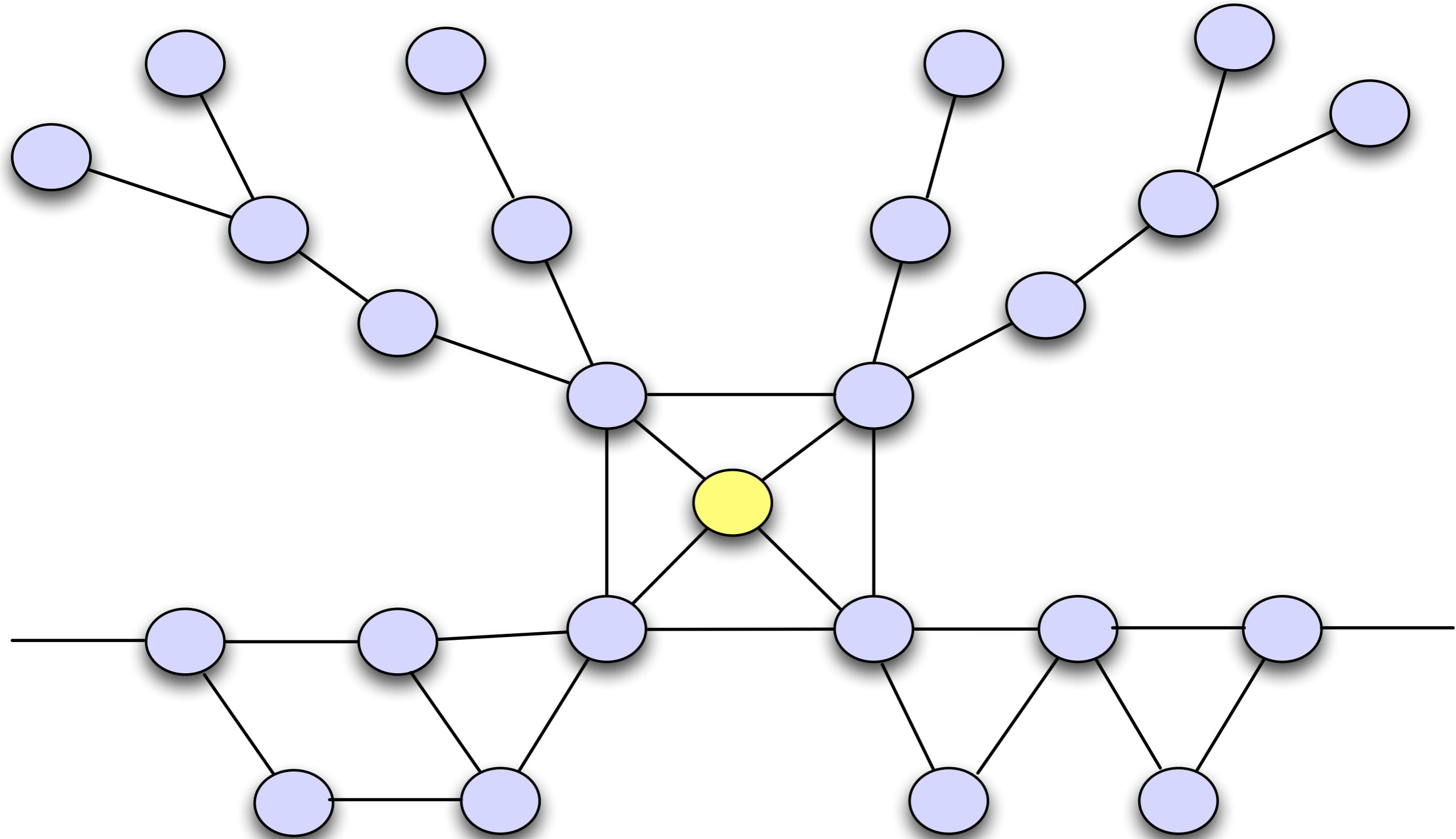
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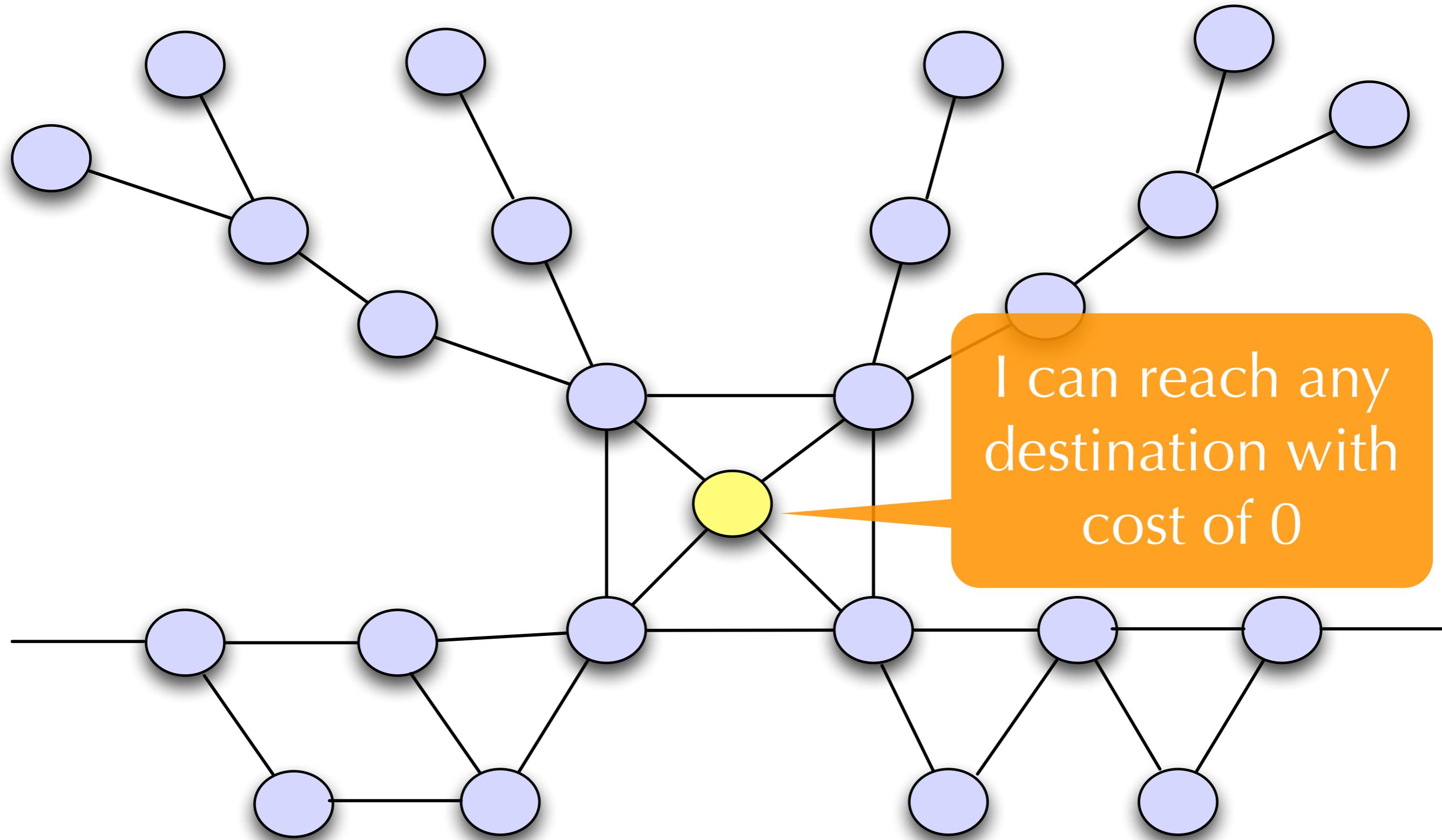
# Talk Outline

- thesis introduction
- placement of smart grid sensors to enable measurement error detection
- recovery from failed communication links in a smart grid
- recovery from malicious nodes injecting false routing state
- outline for future work and conclusions

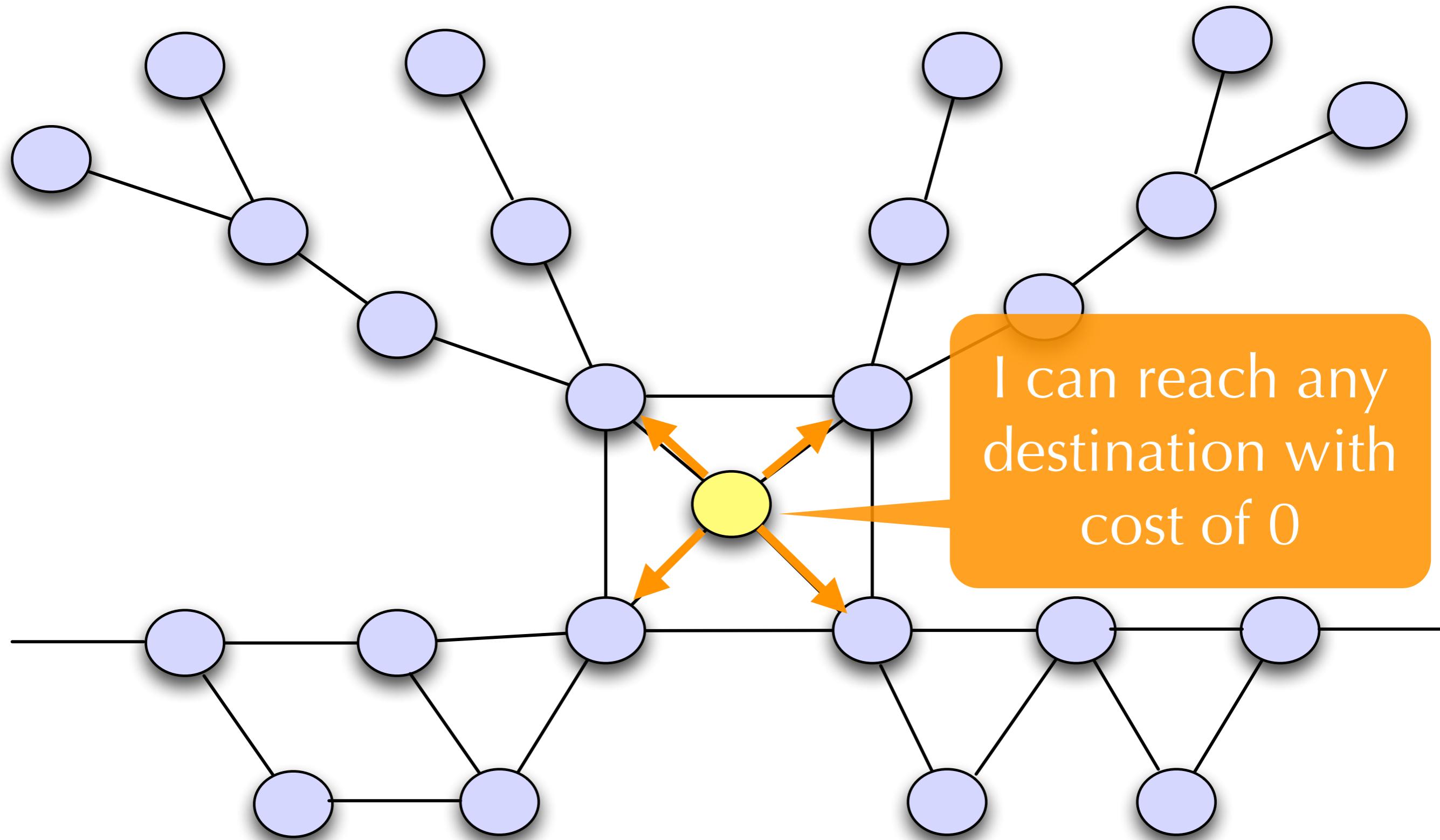
# Ch 3: Network Router Failure



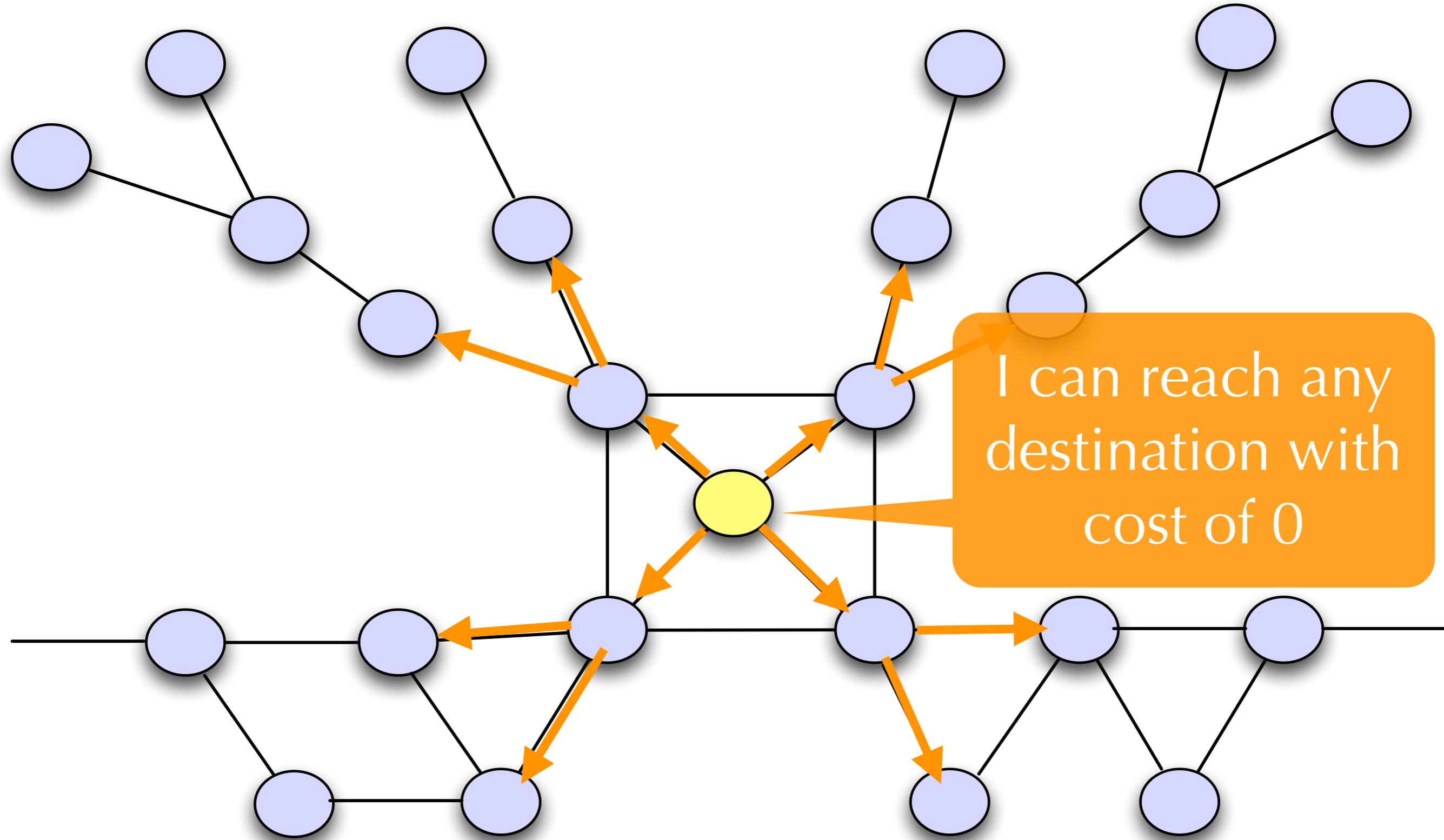
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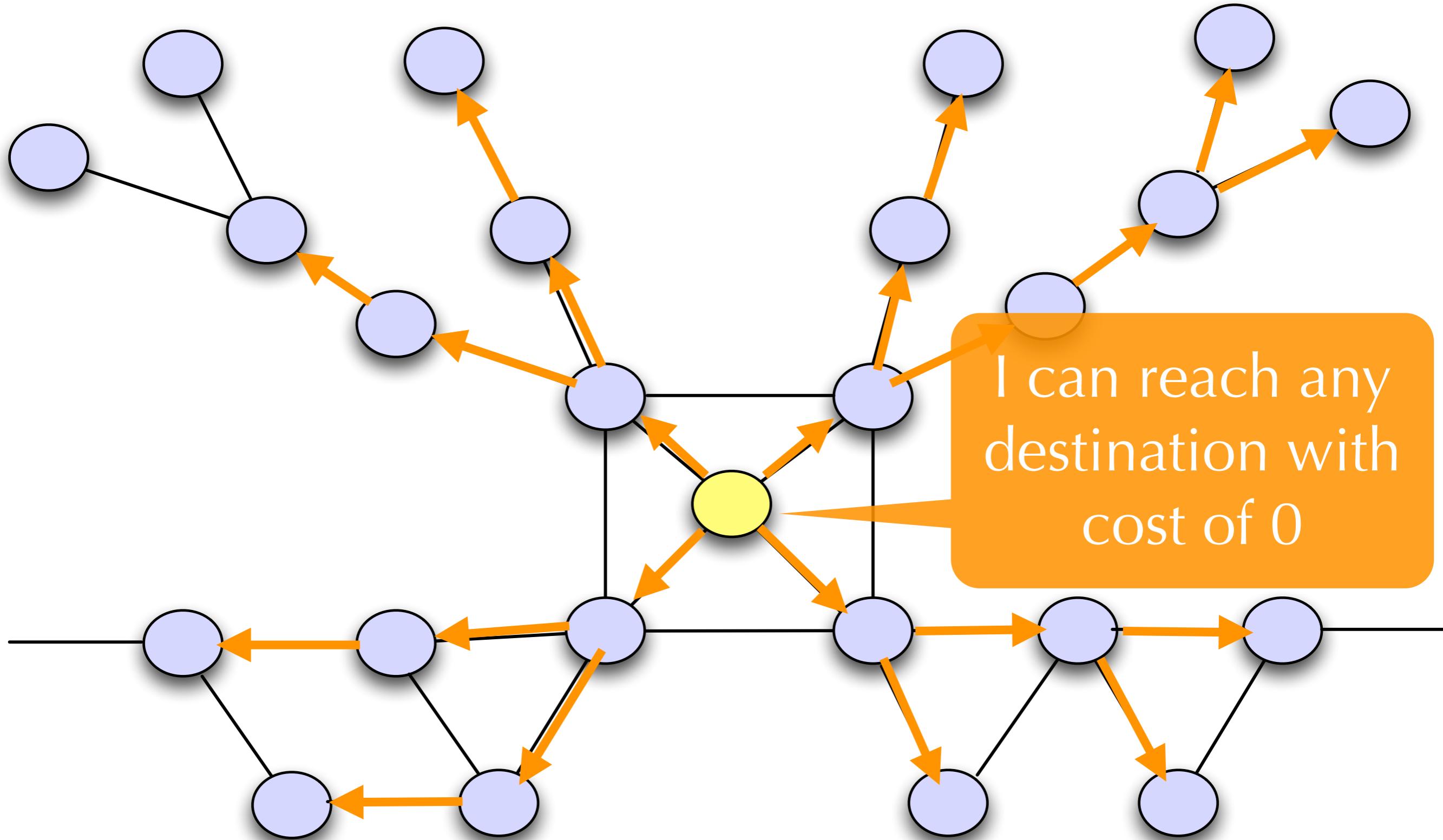
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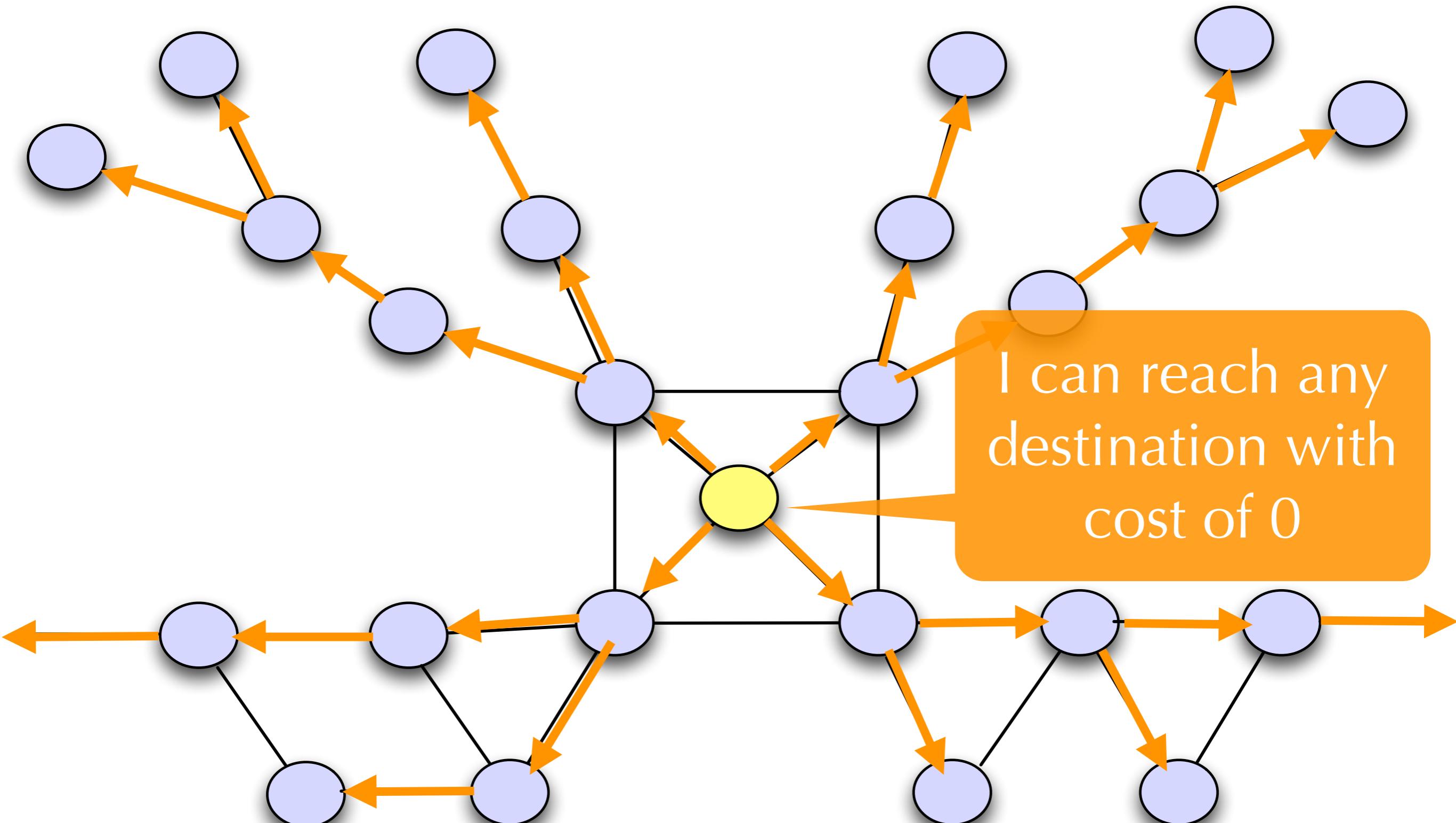
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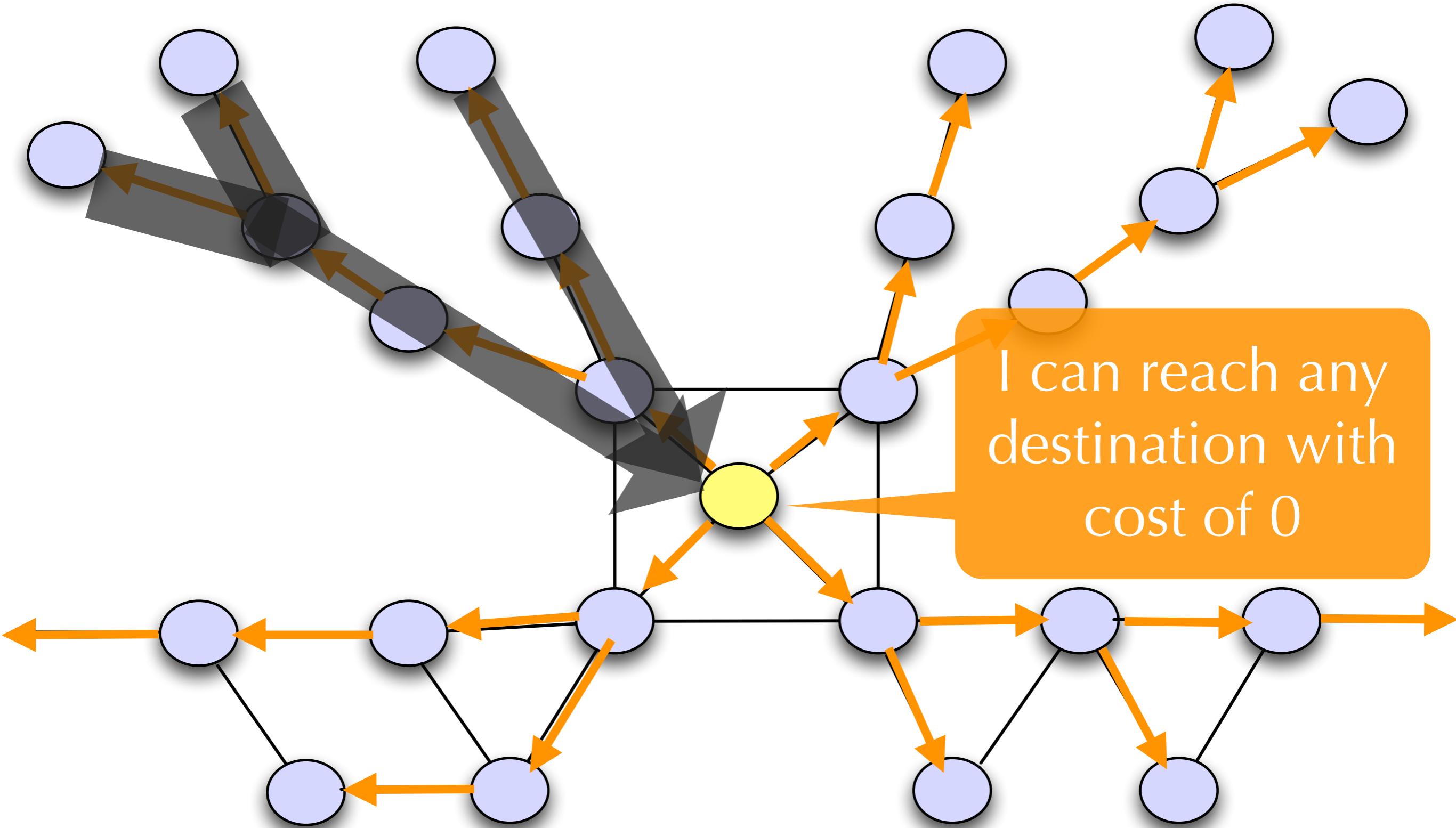
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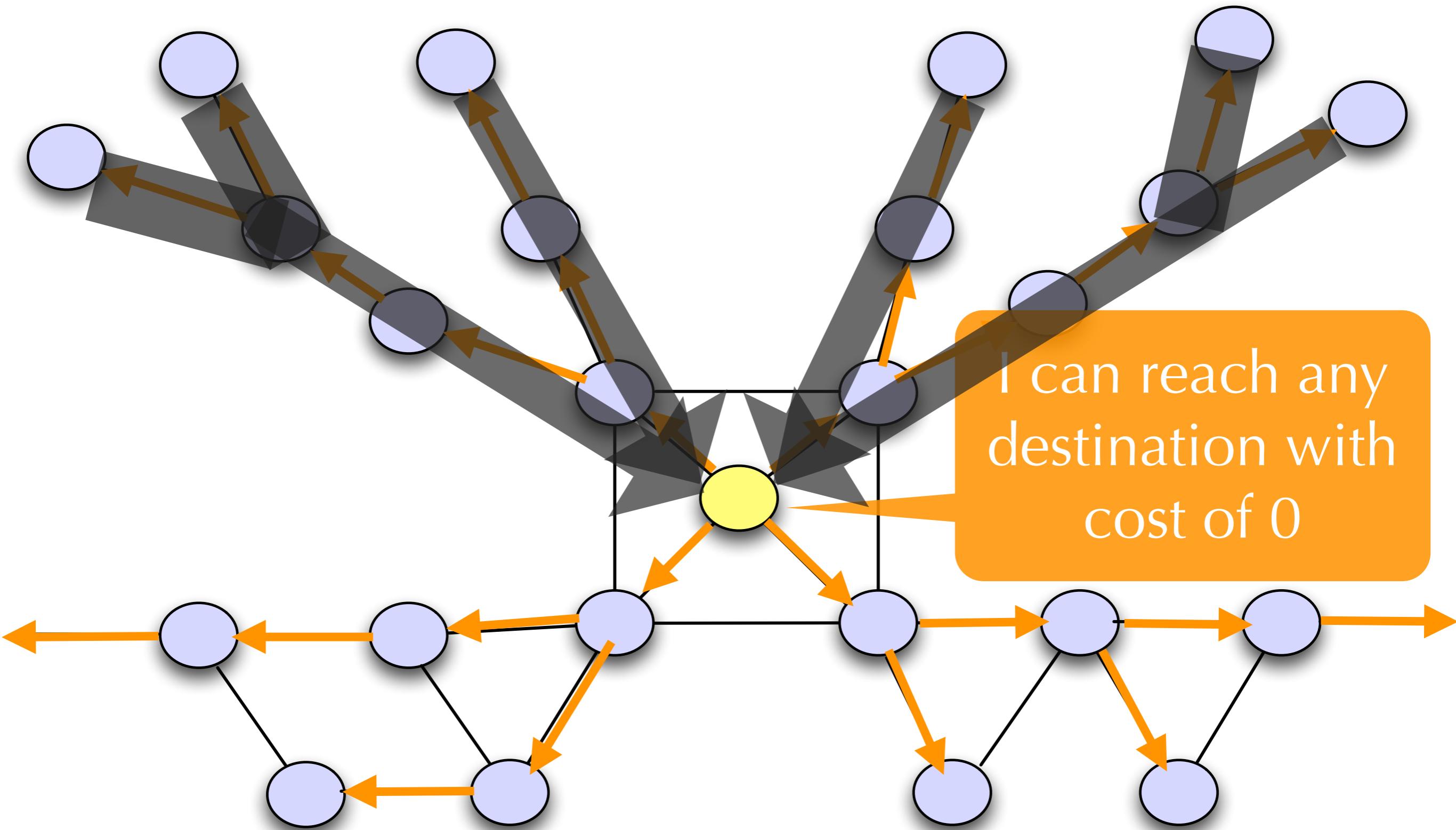
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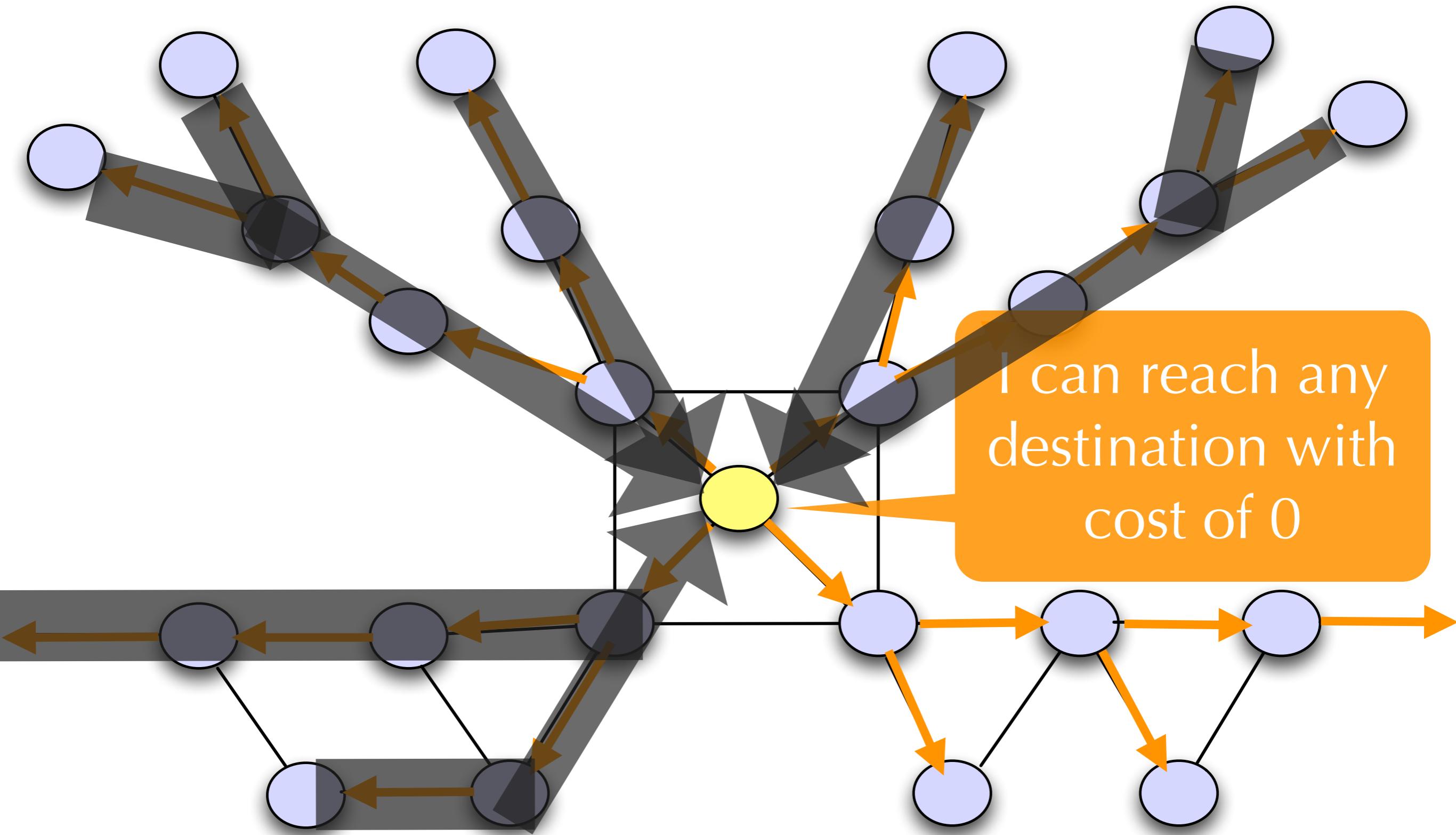
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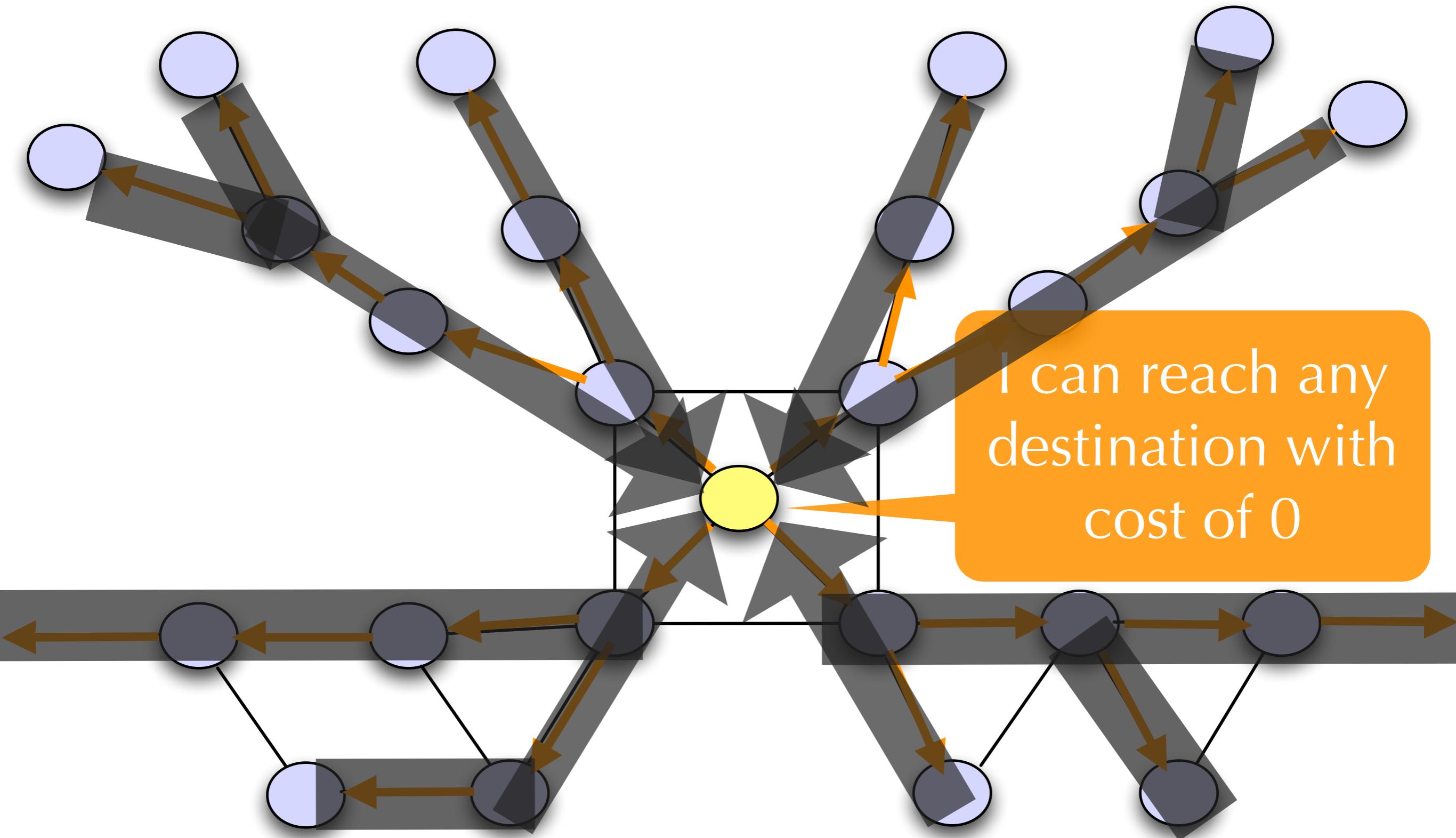
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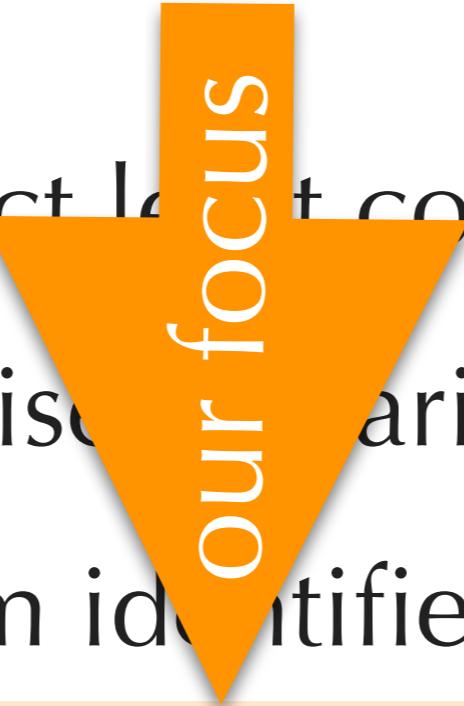
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  - b. compute least cost paths that route around compromised nodes

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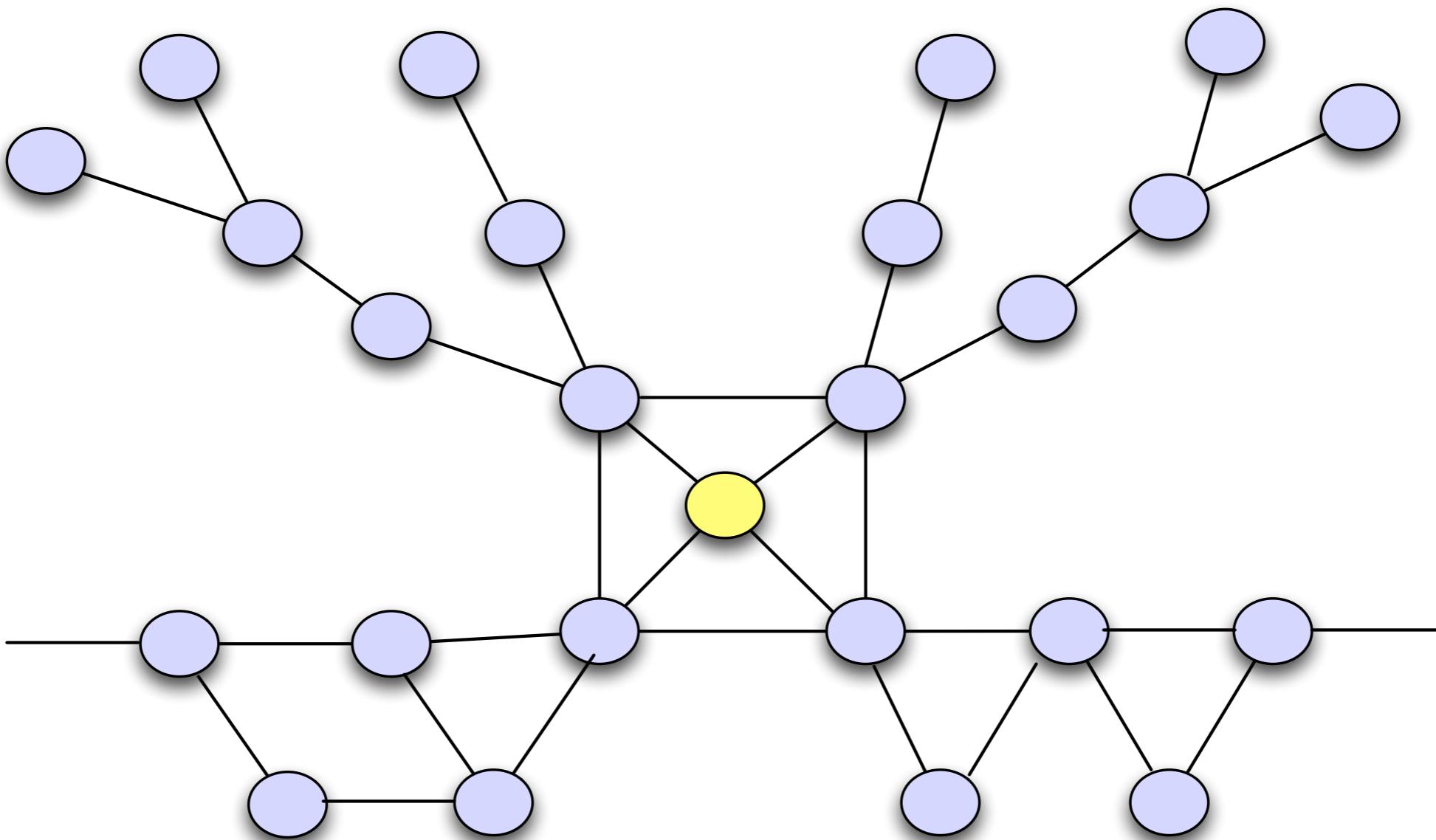
Our focus

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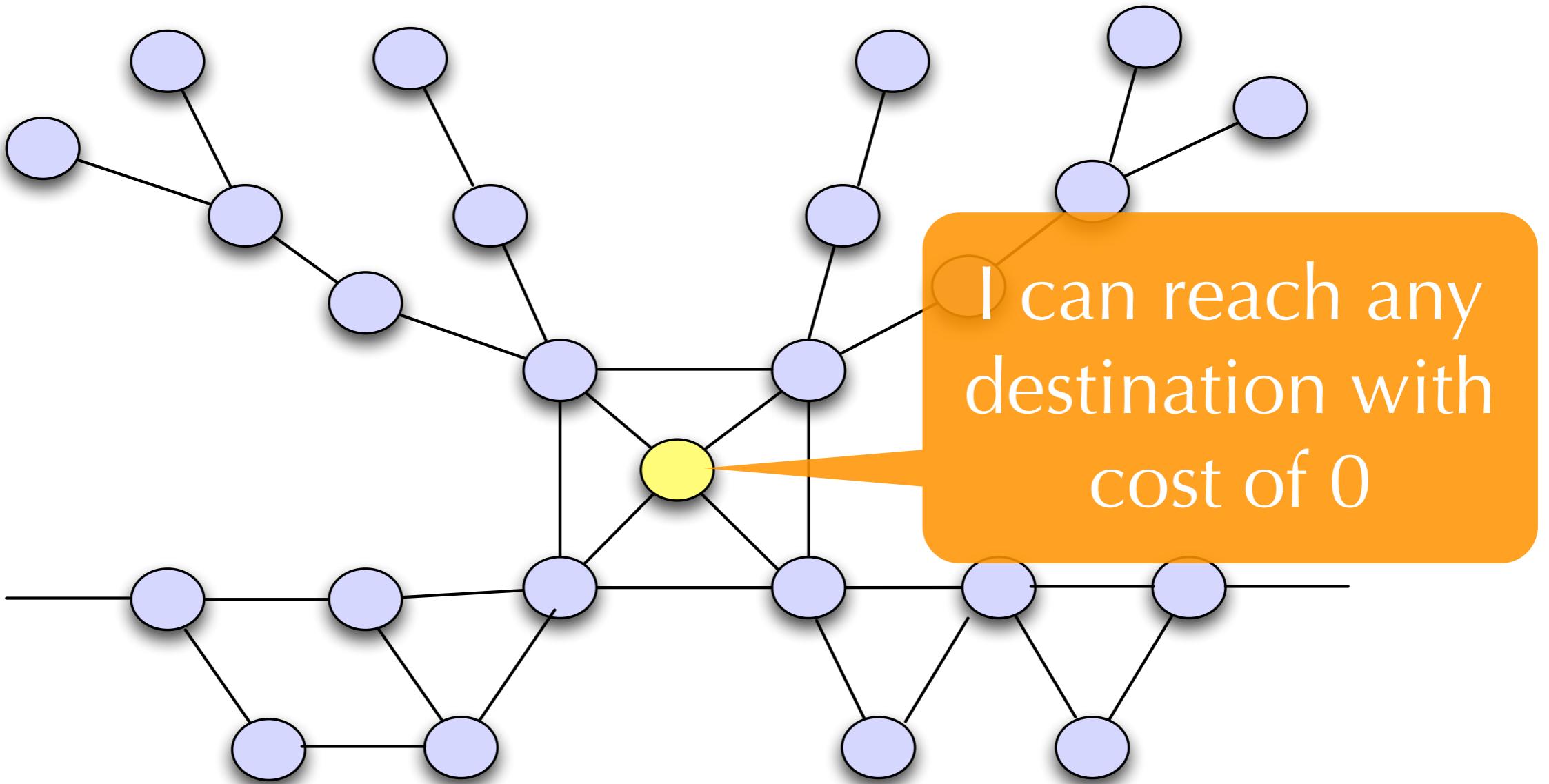
# 3 Recovery Algorithms

1. 2nd BEST algorithm
2. PURGE algorithm
3. CPR algorithm

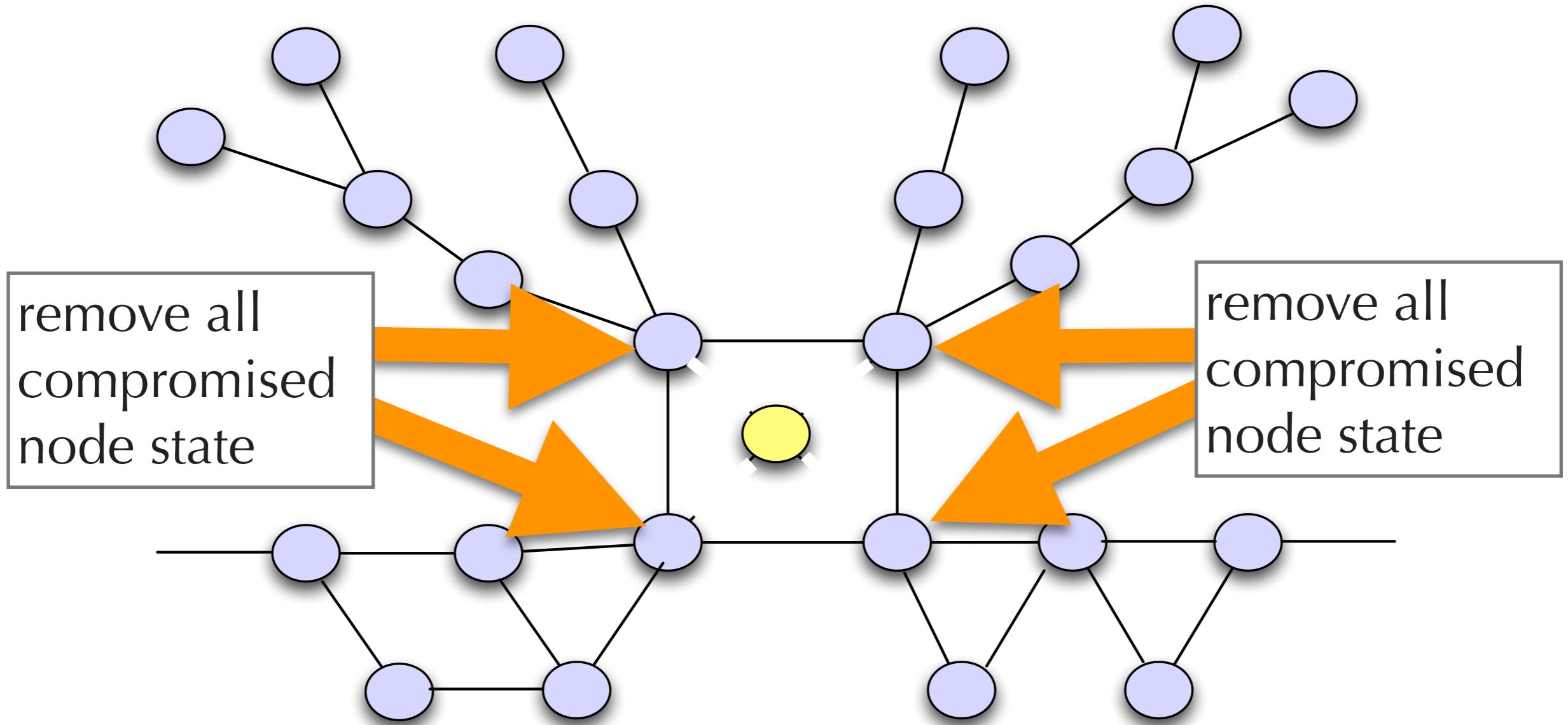
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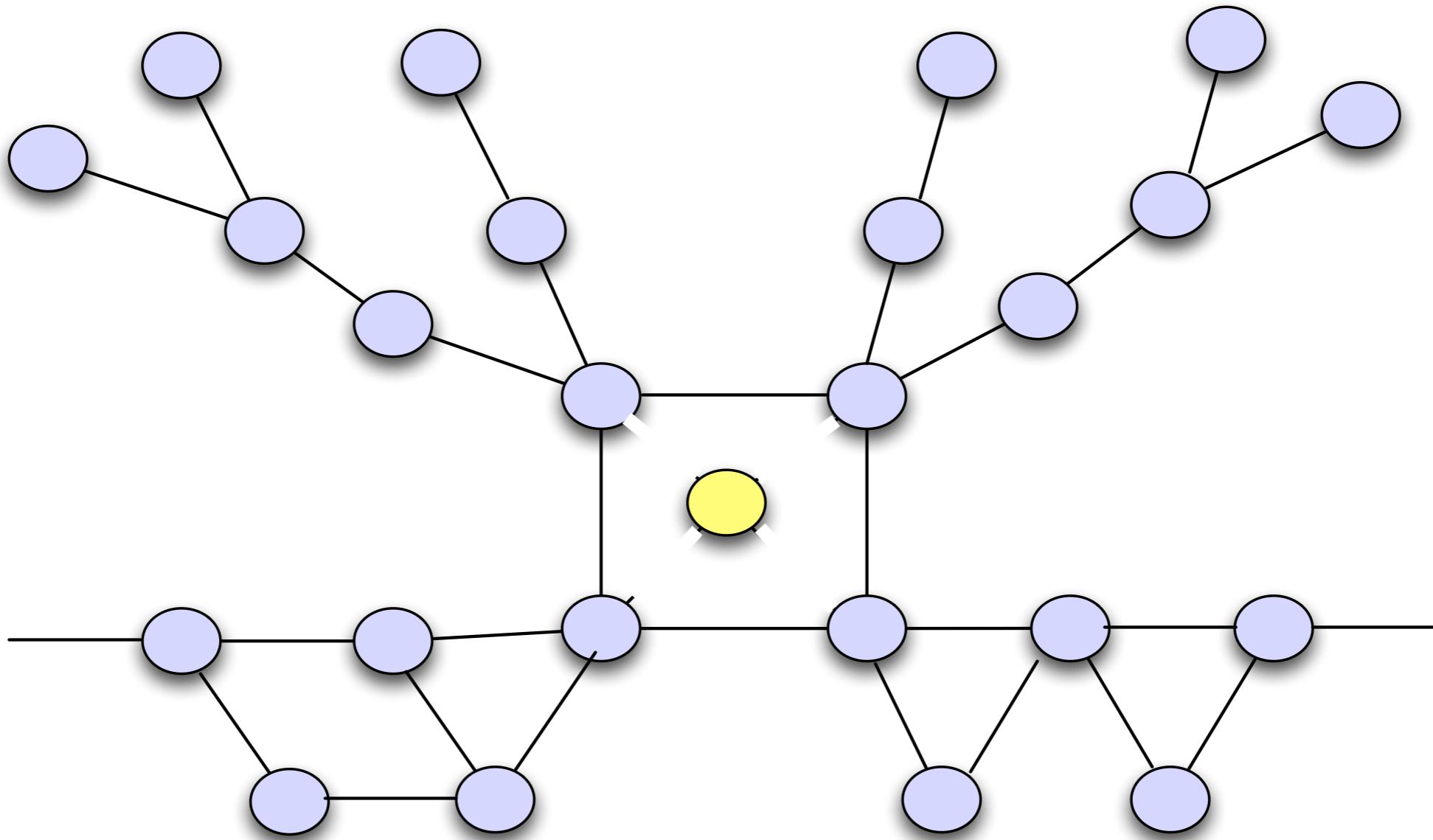


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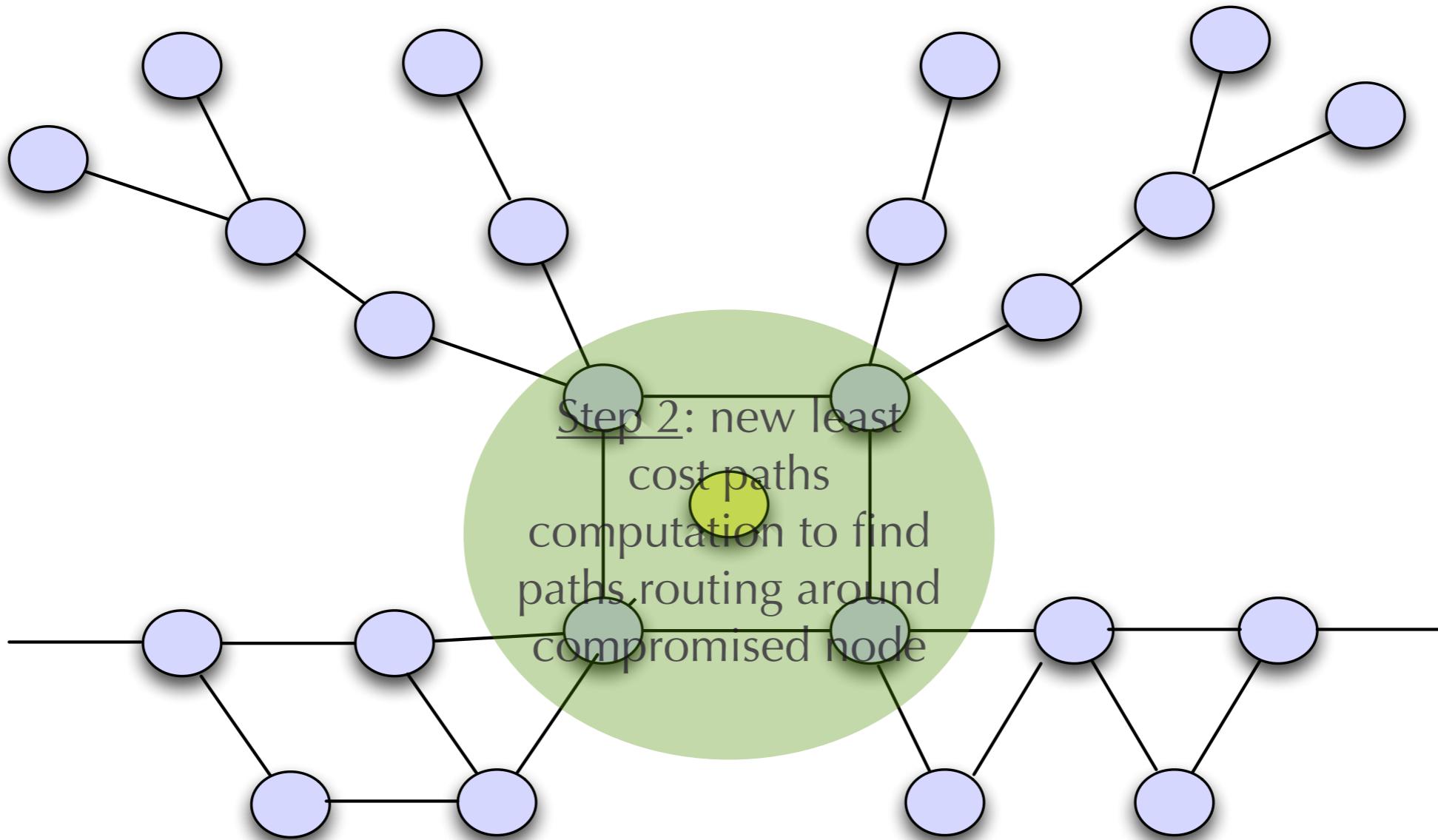
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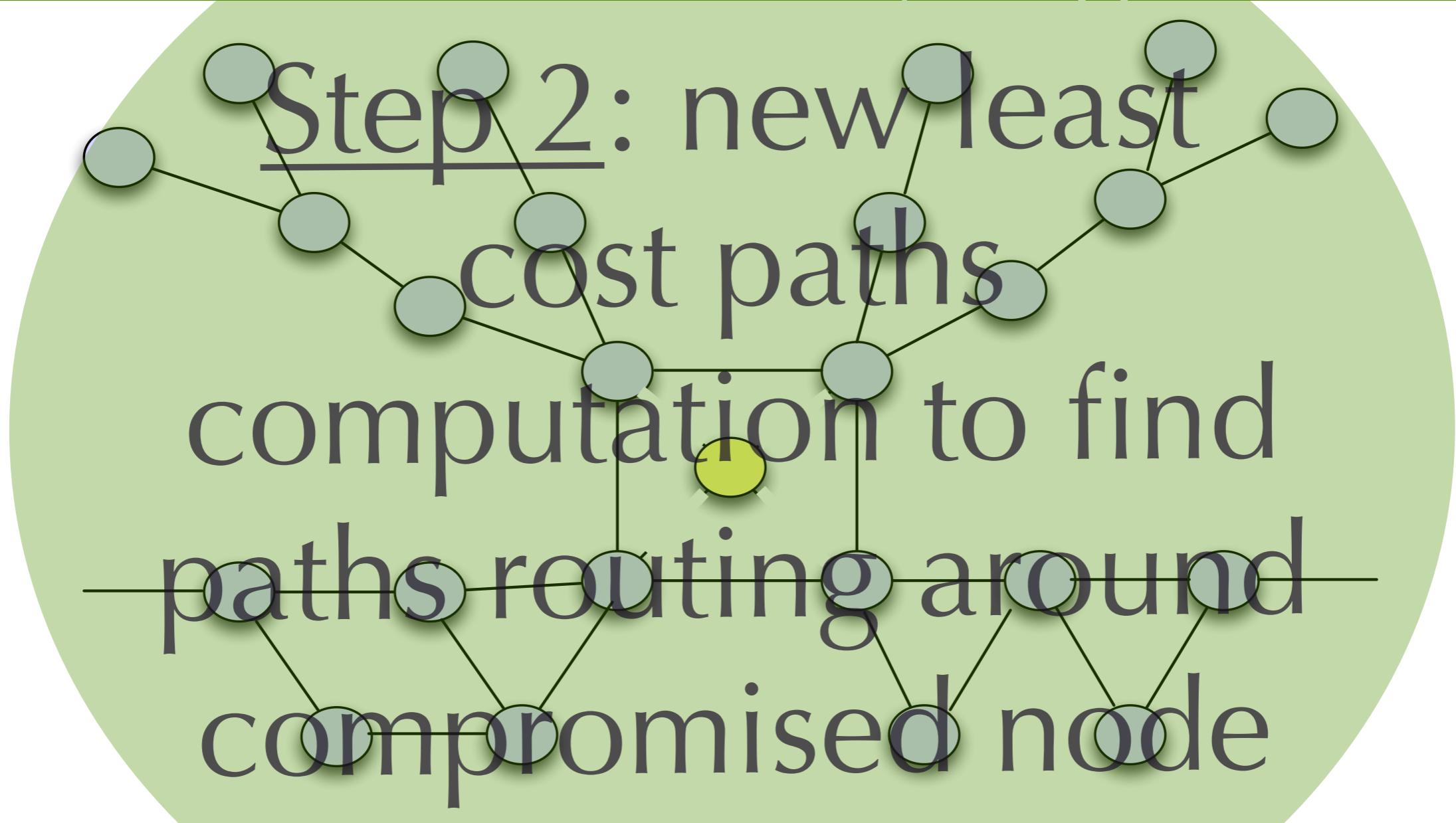
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# 2nd BEST Recovery Algorithm



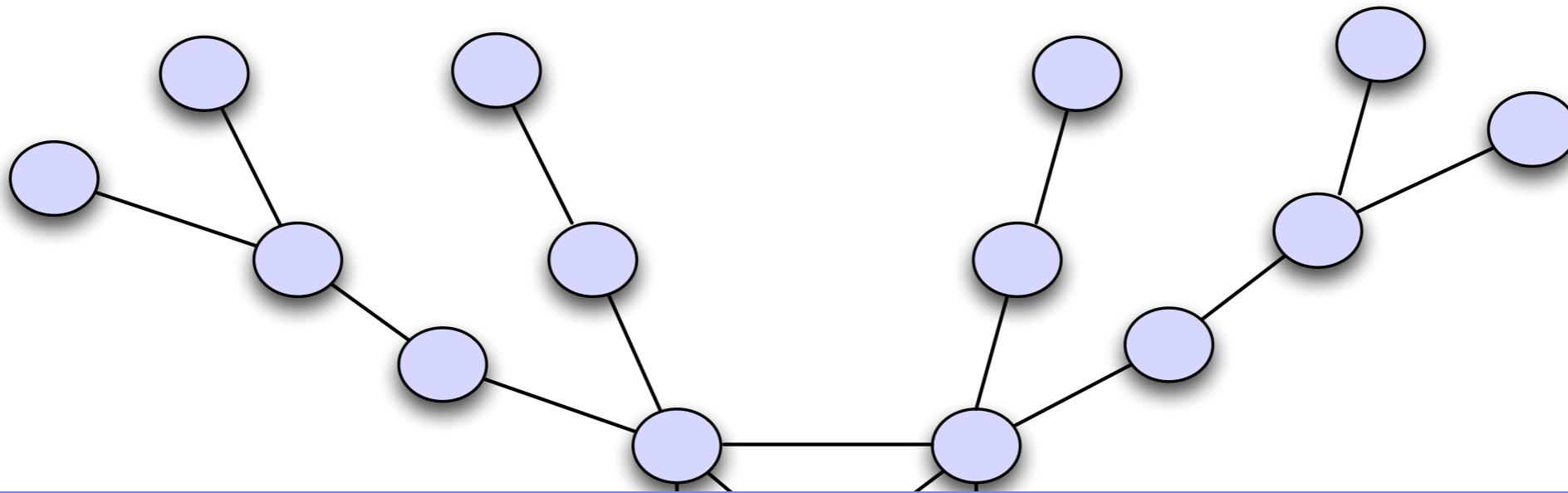
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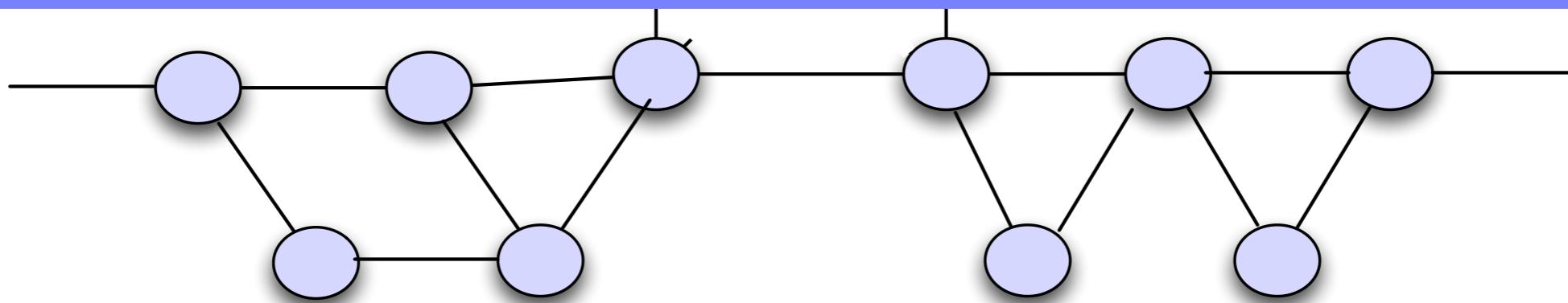


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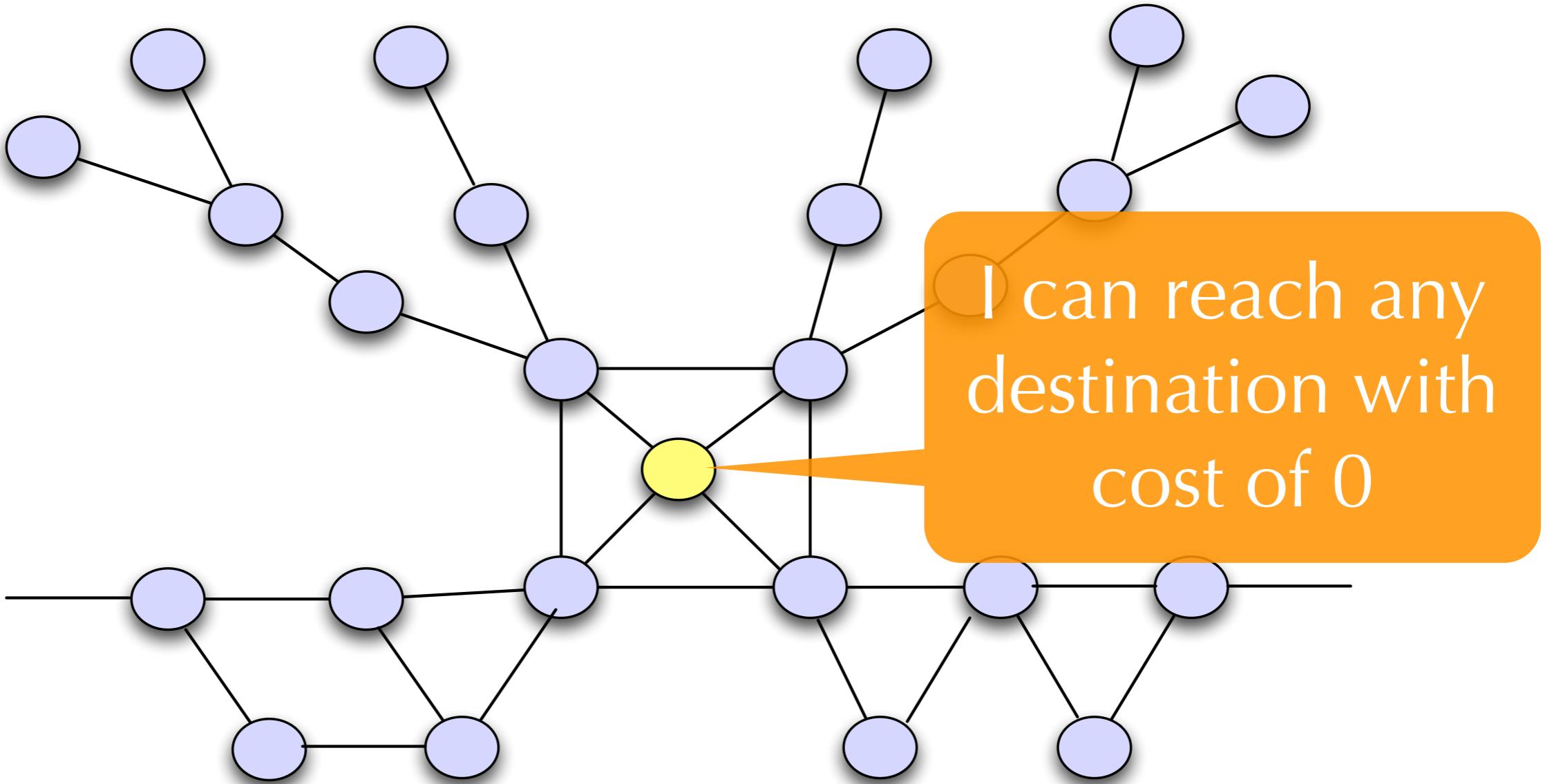


(+) simple, (-) risk of routing loops

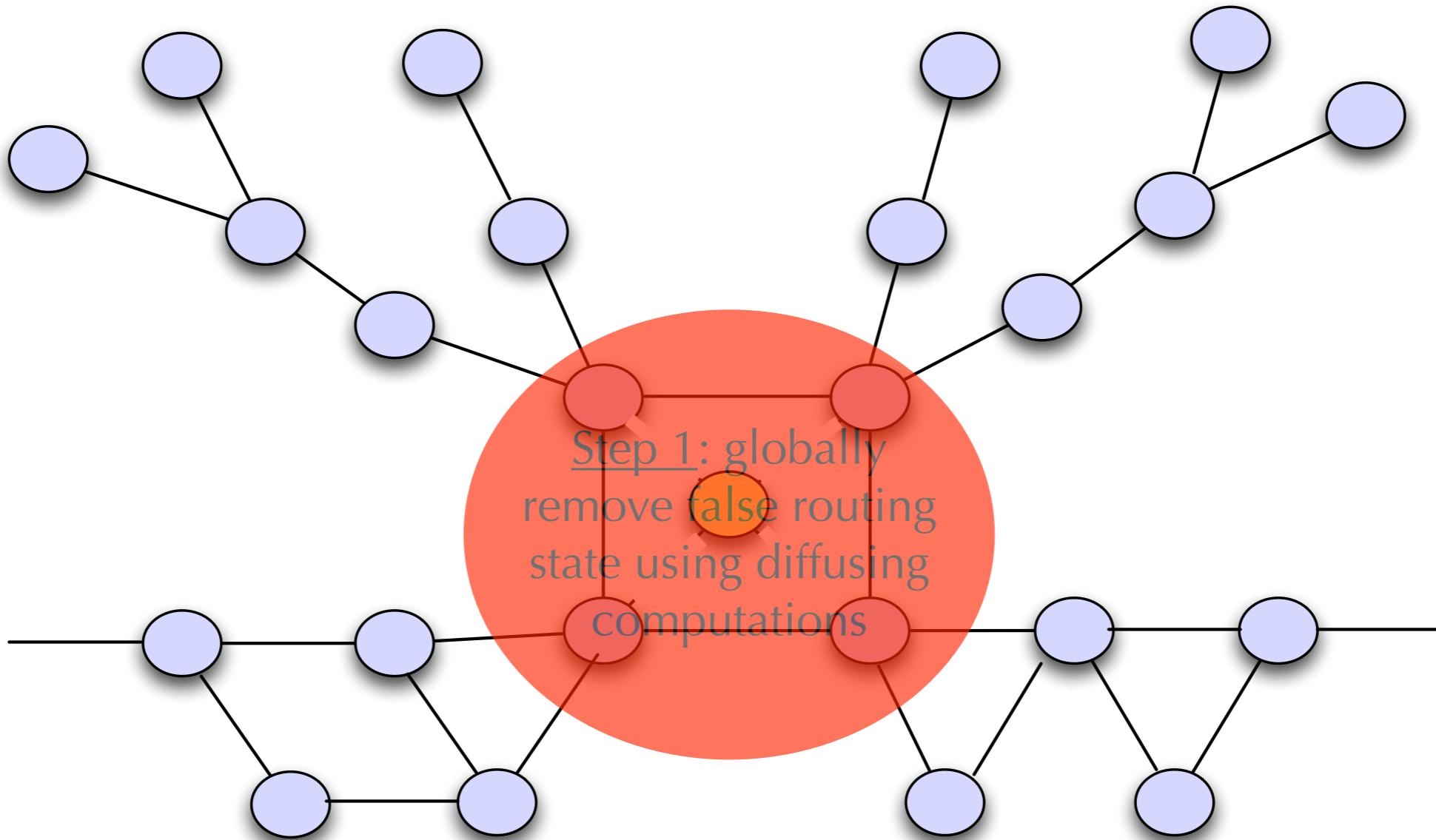


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# PURGE Recovery Algorithm



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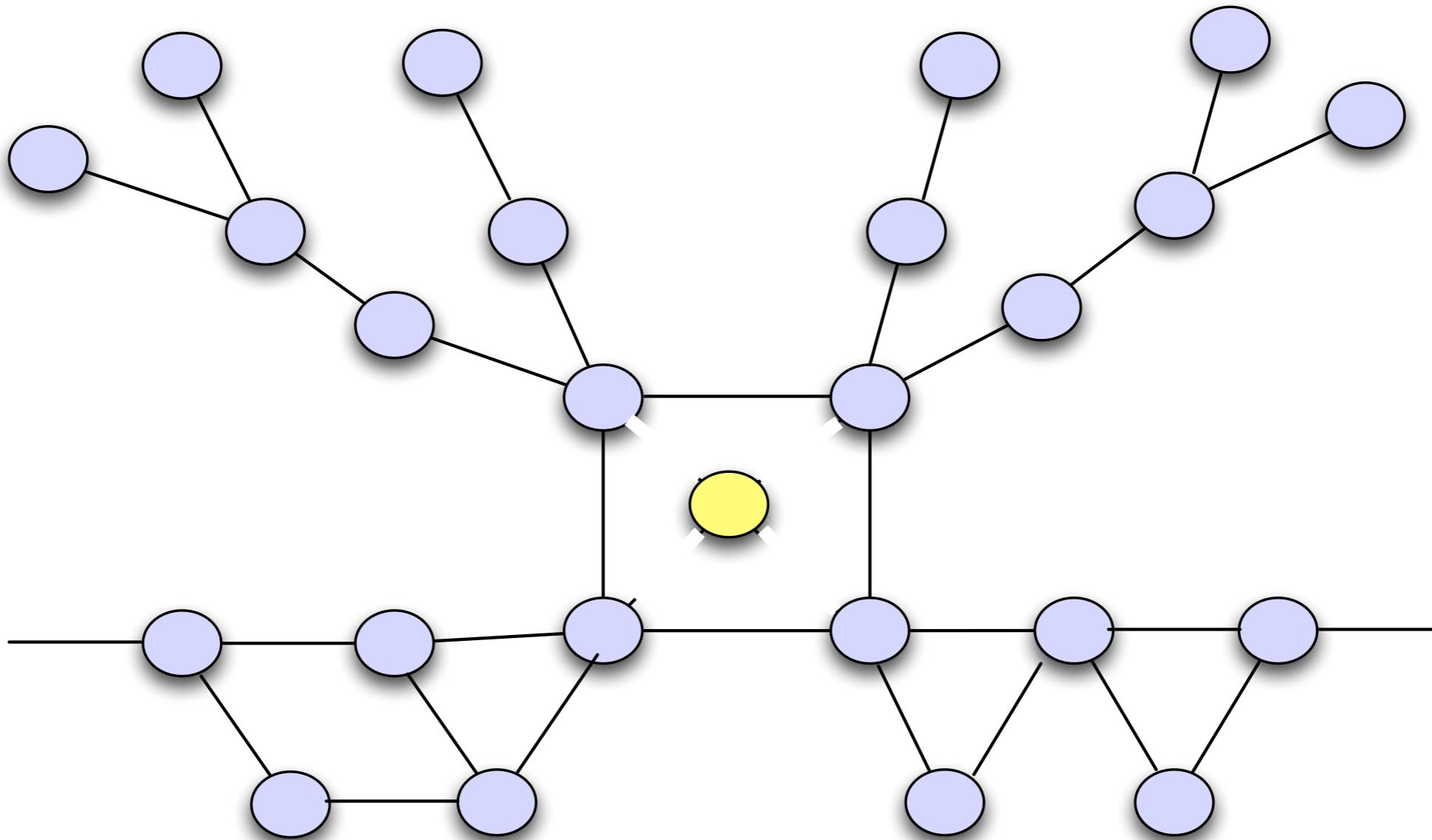
1. globally remove false routing state using diffusing computations

# PURGE Recovery Algorithm

Step 1: globally  
remove false routing  
state using diffusing  
computations

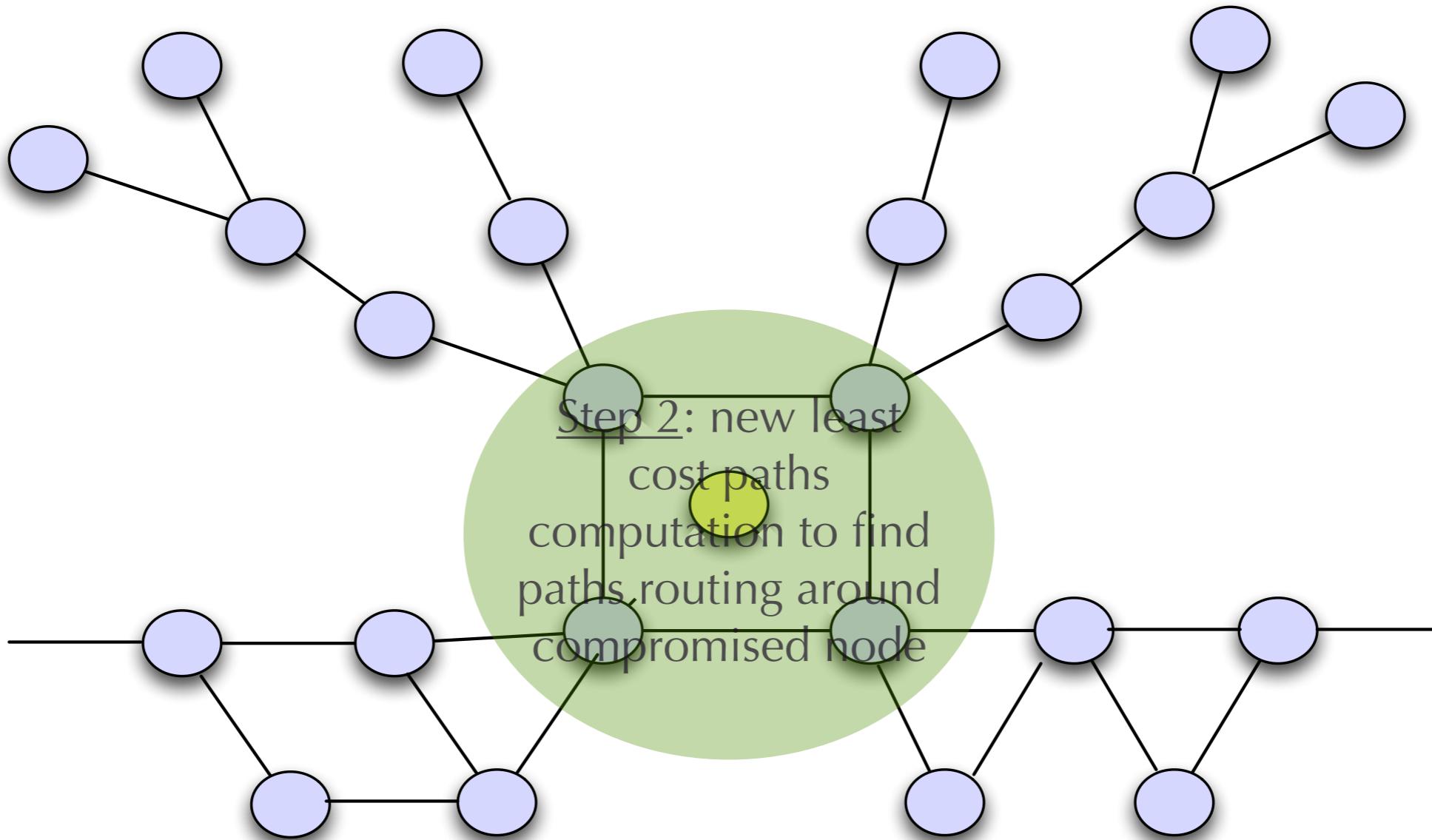
1. globally remove false routing state using diffusing computations

# PURGE Recovery Algorithm



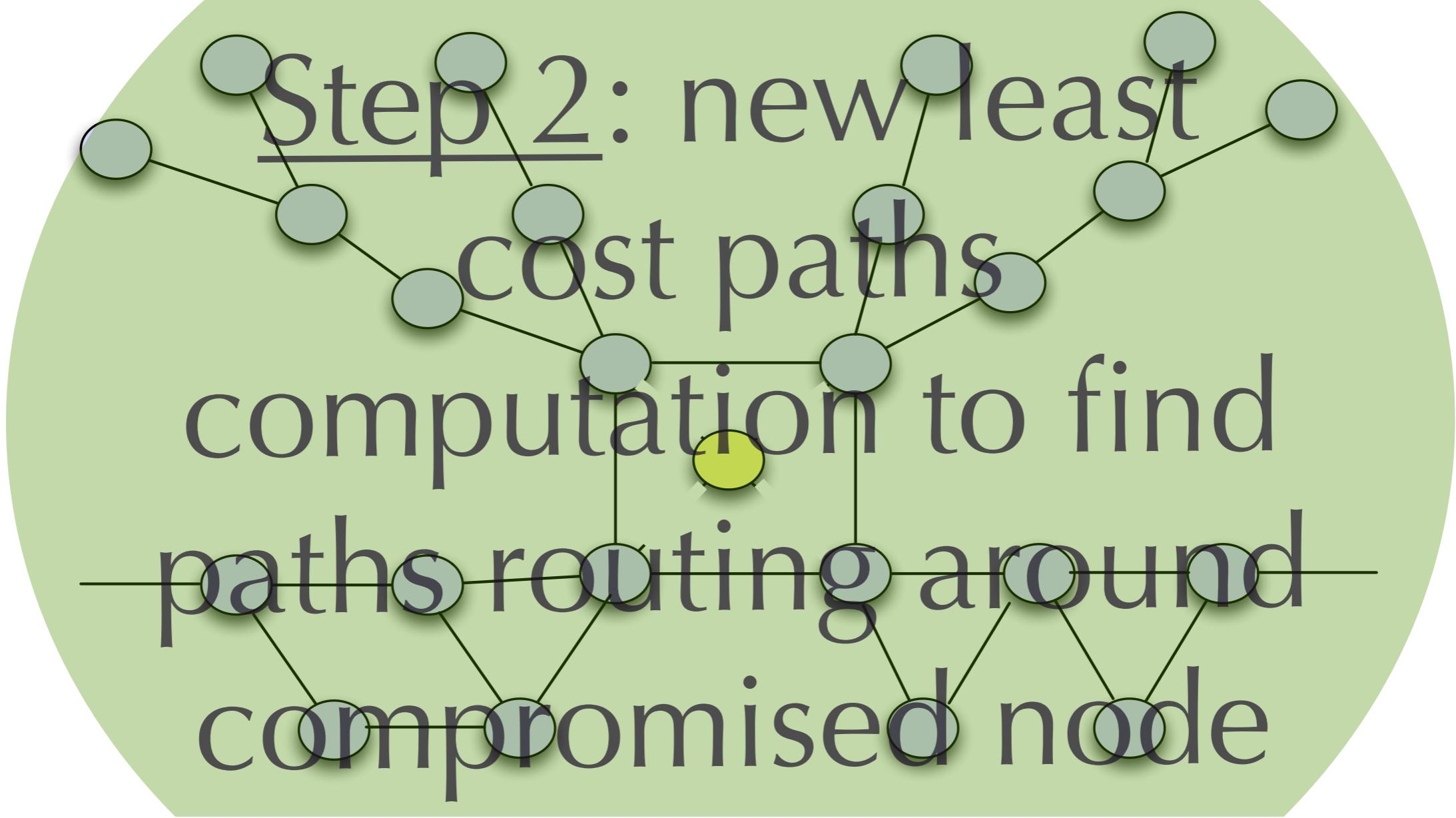
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# PURGE Recovery Algorithm



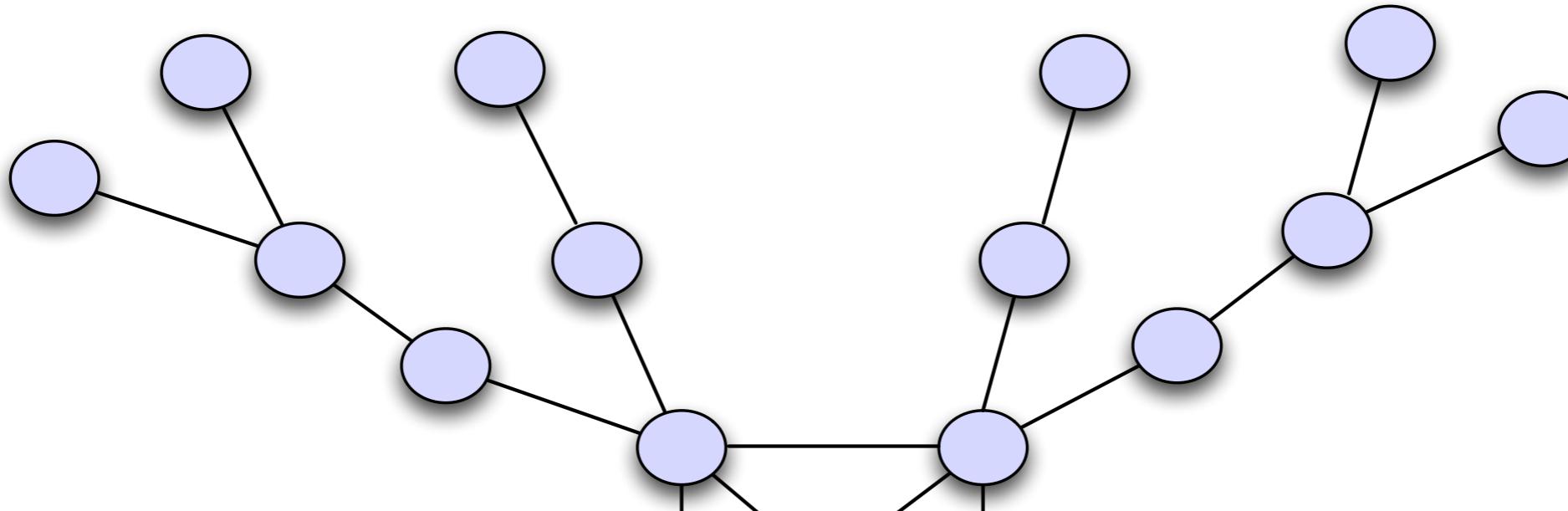
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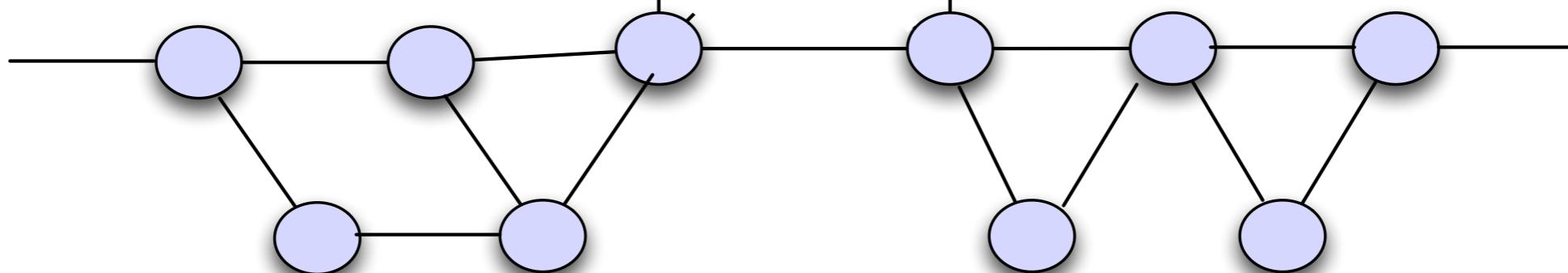


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# PURGE Recovery Algorithm

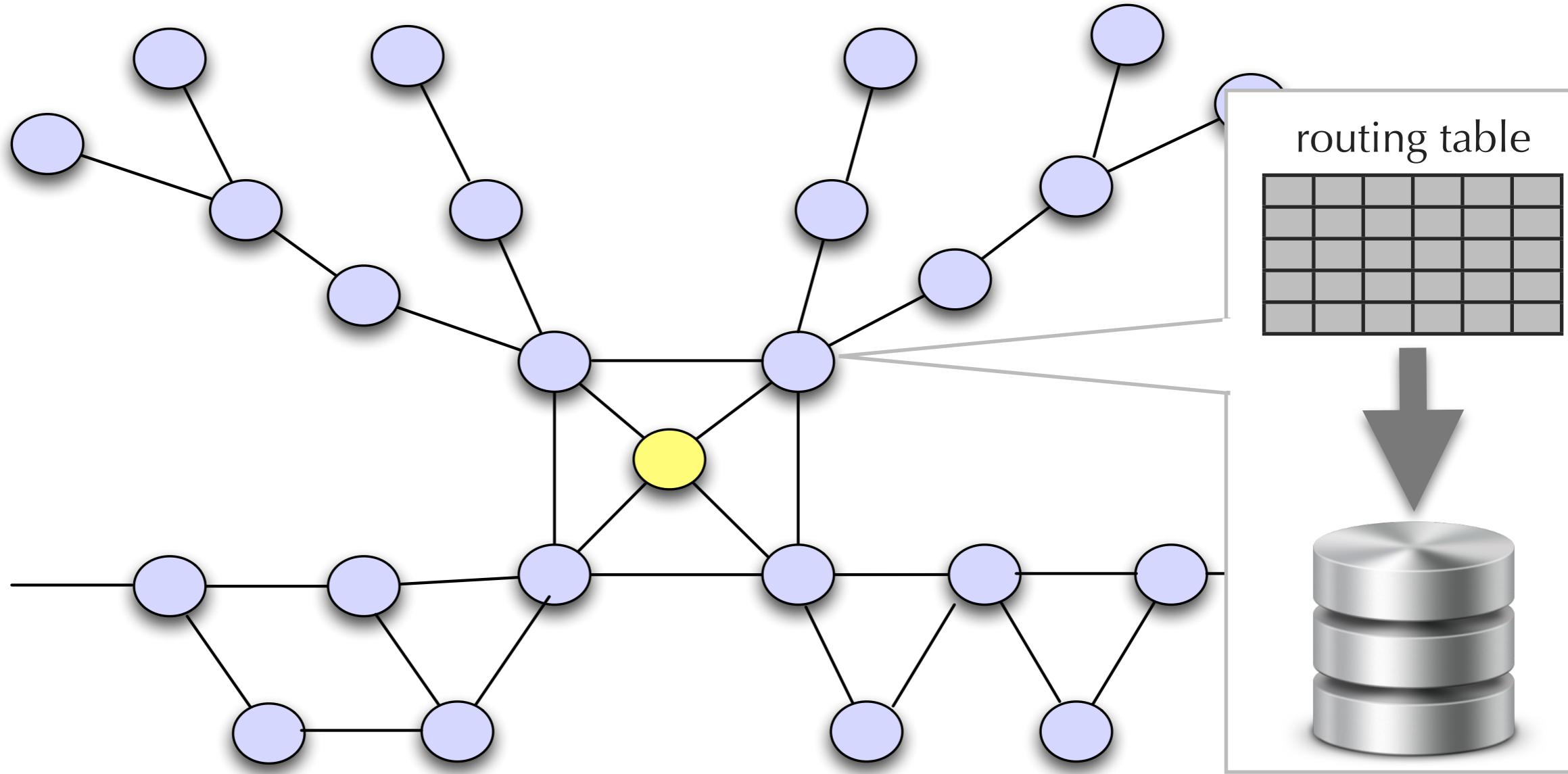


(+) removes all routing loops



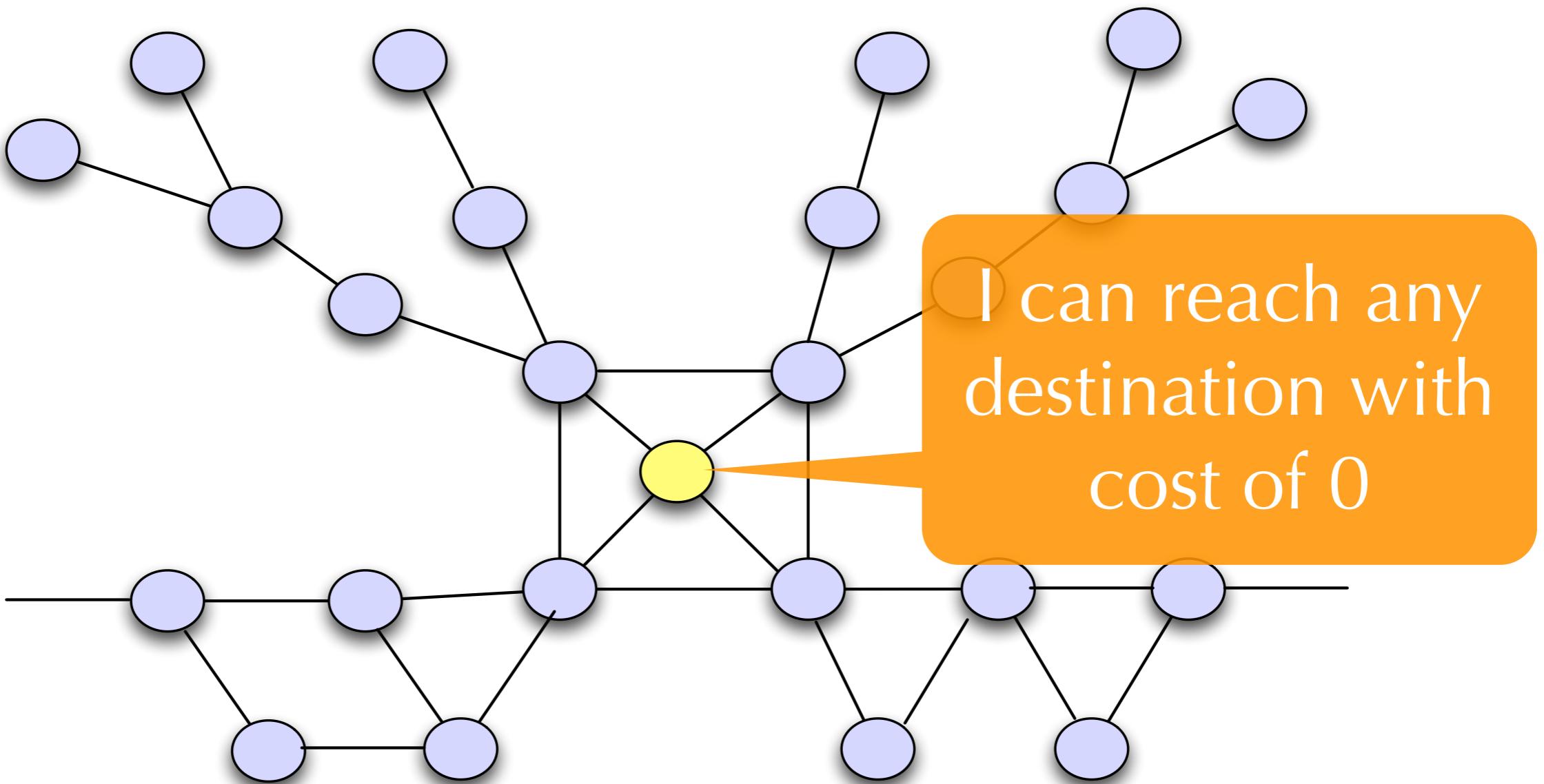
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# CPR Recovery Algorithm



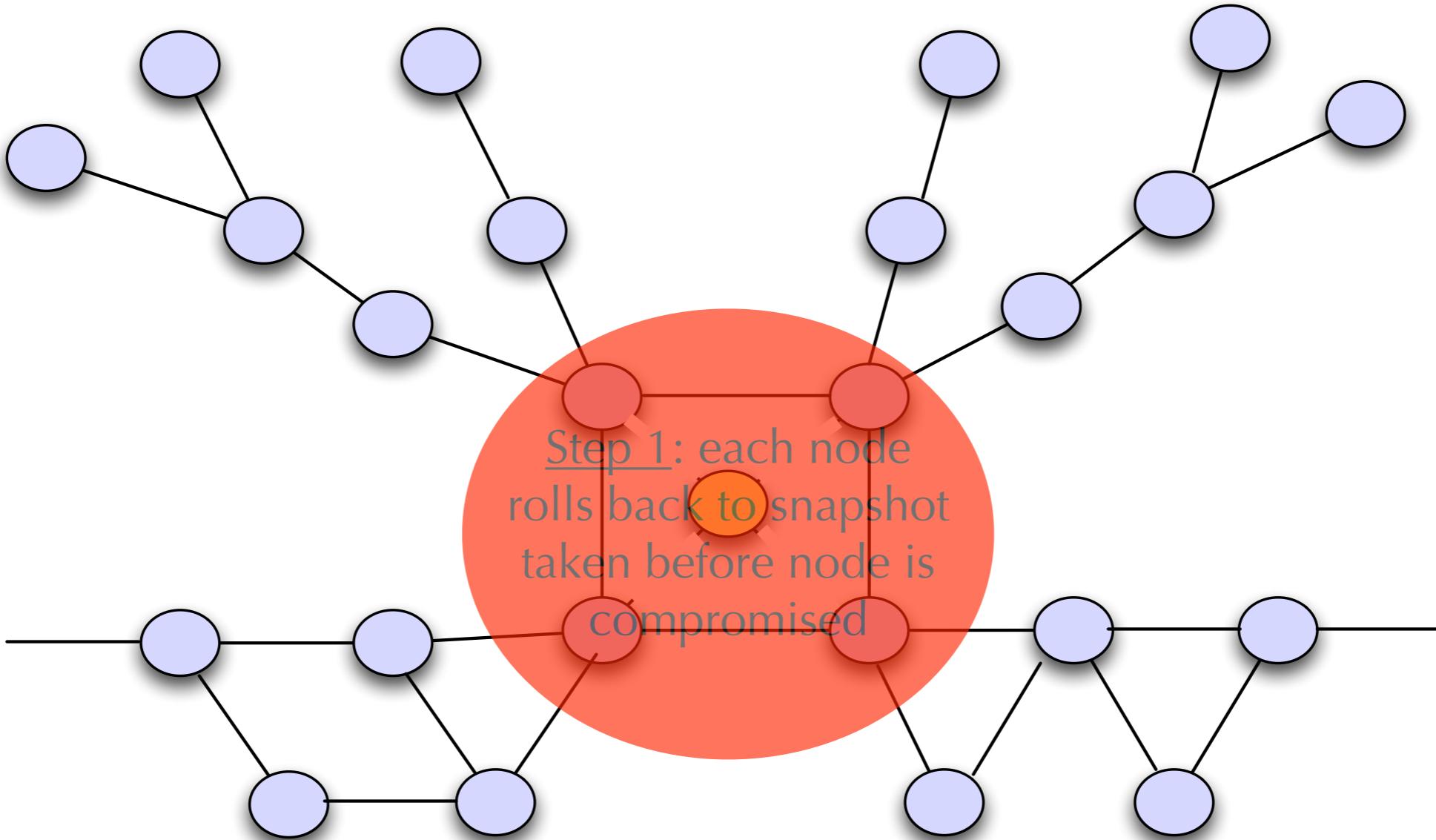
- each node takes snapshot of its routing table

# CPR Recovery Algorithm



- each node takes snapshot of its routing table

# CPR Recovery Algorithm



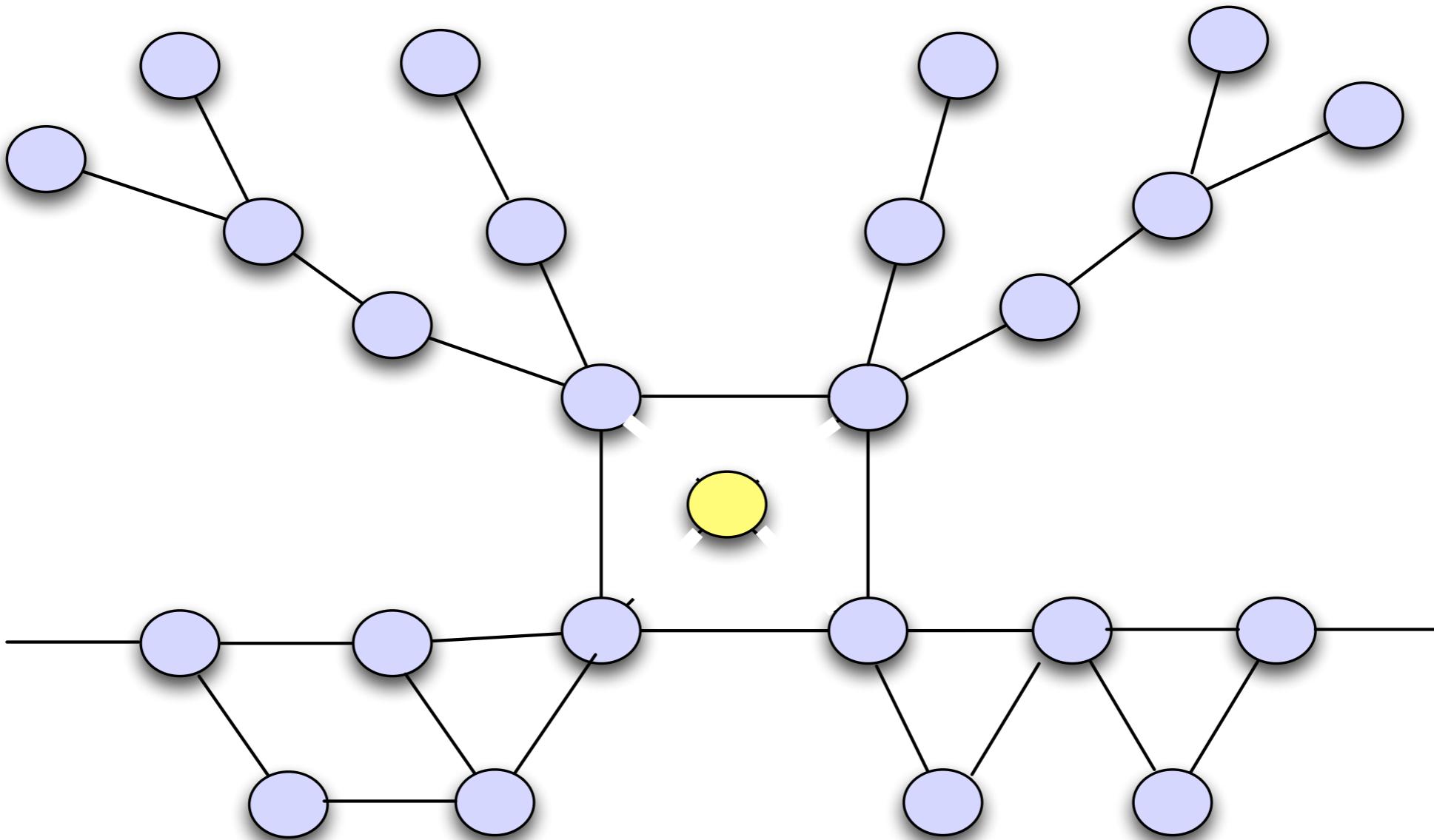
- each node takes snapshot of its routing table
- 1. roll back to snapshot taken before node compromised

# CPR Recovery Algorithm

Step 1: each node rolls back to snapshot taken before node is compromised

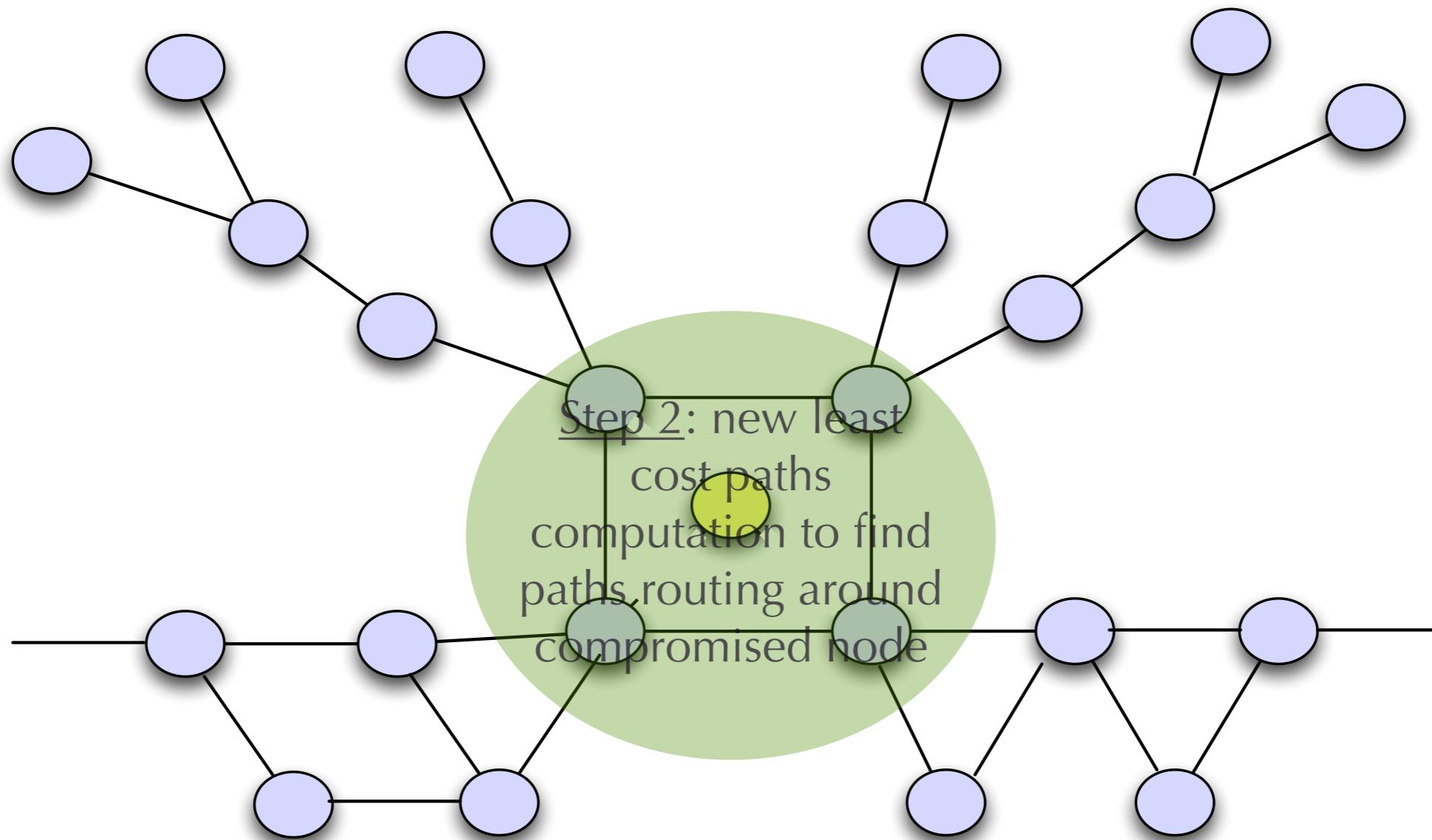
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# CPR Recovery Algorithm



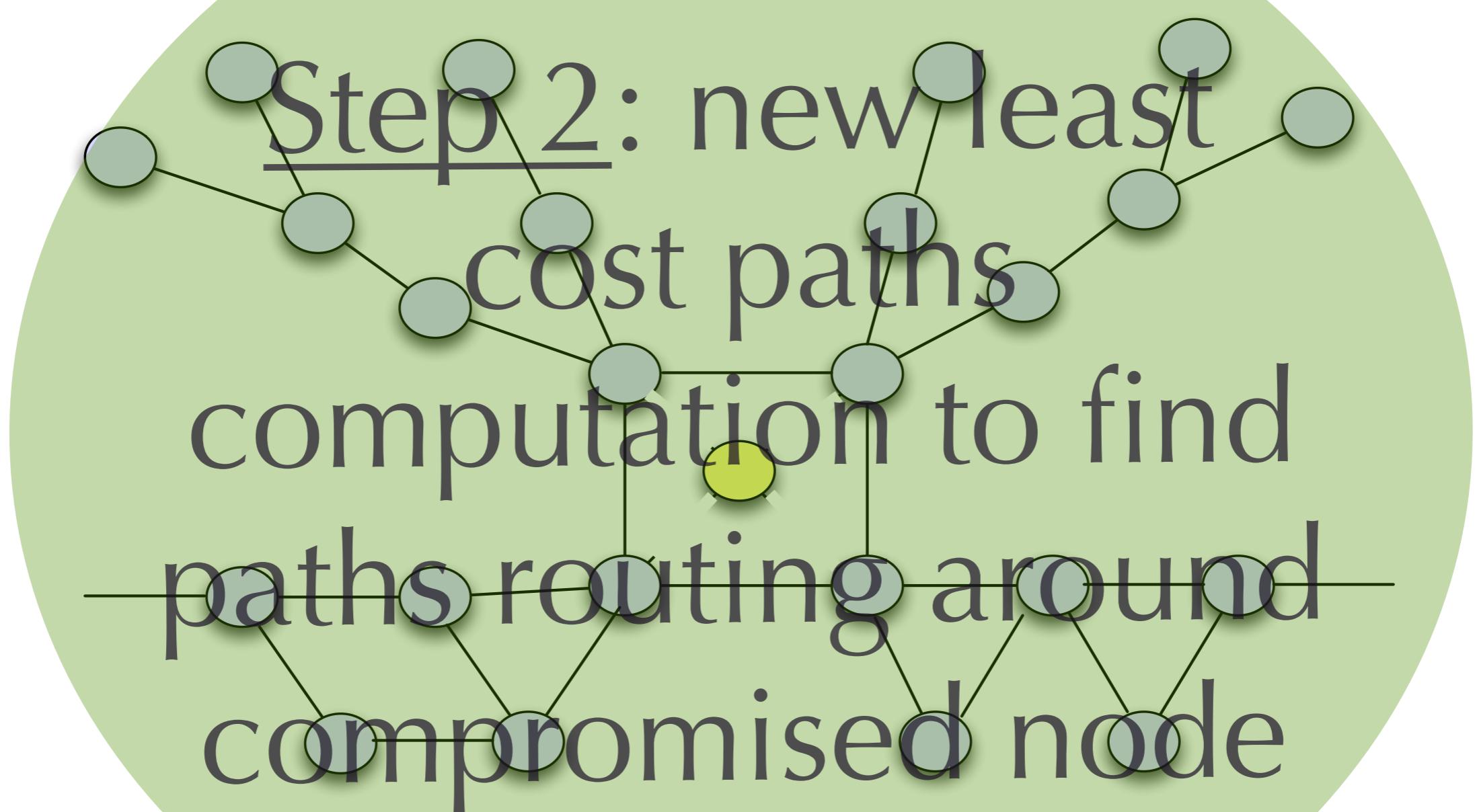
- each node takes snapshot of its routing table
  1. roll back to snapshot taken before node compromised
  2. run DV to compute new least cost paths routing around compromised node + update any stale state

# CPR Recovery Algorithm



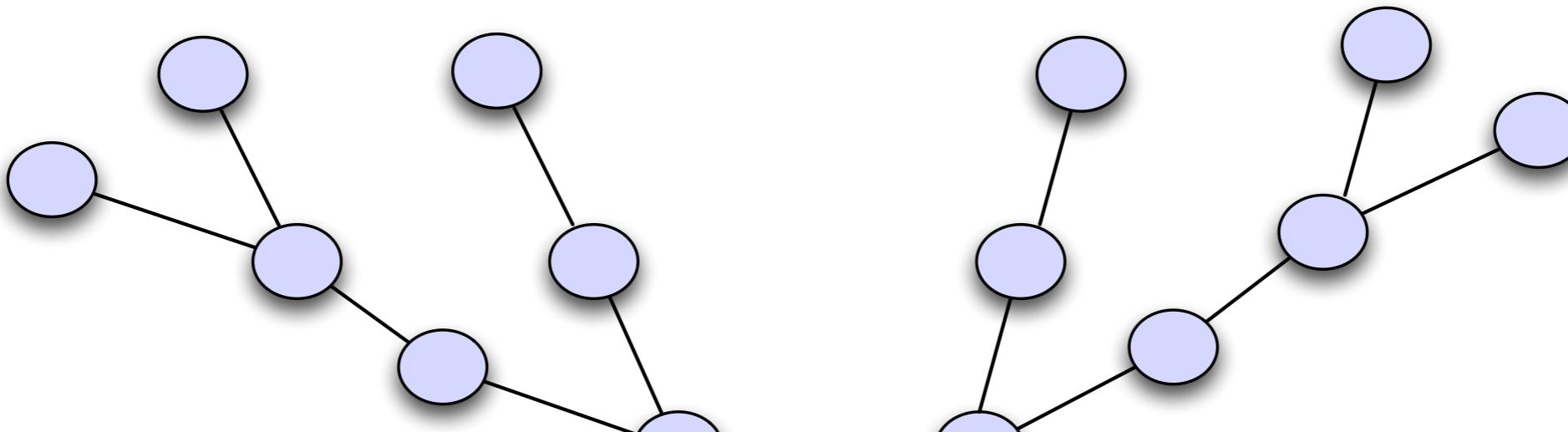
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# CPR Recovery Algorithm



- each node takes snapshot of its routing table
- 1. roll back to snapshot taken before node compromised
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# CPR Recovery Algorithm



- (+) remove false state w/ single diffusing comp.,
- (-) requires synchronized clocks,
- (-) storage overhead



- each node takes snapshot of its routing table
  1. roll back to snapshot taken before node compromised
  2. run DV to compute new least cost paths routing around compromised node + update any stale state

# Related Work

- PURGE is similar to Garcia-Luna-Aceves' DUAL algorithm for loop-free routing [26]
  - ▶ both use diffusing computations
- CPR borrows ideas from
  - ▶ database crash recovery Mohan et al. [39]
  - ▶ recovery from malicious but committed database transactions Ammann et al. [6], Liu et al. [35]

# Evaluation

- what is the relative performance of each algorithm?
  - ▶ simulation study
    - use synchronous communication model
    - observe same trends w/ asynchronous model
  - ▶ complexity bounds in report

# Simulation Scenario

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1. all nodes correctly compute least cost paths

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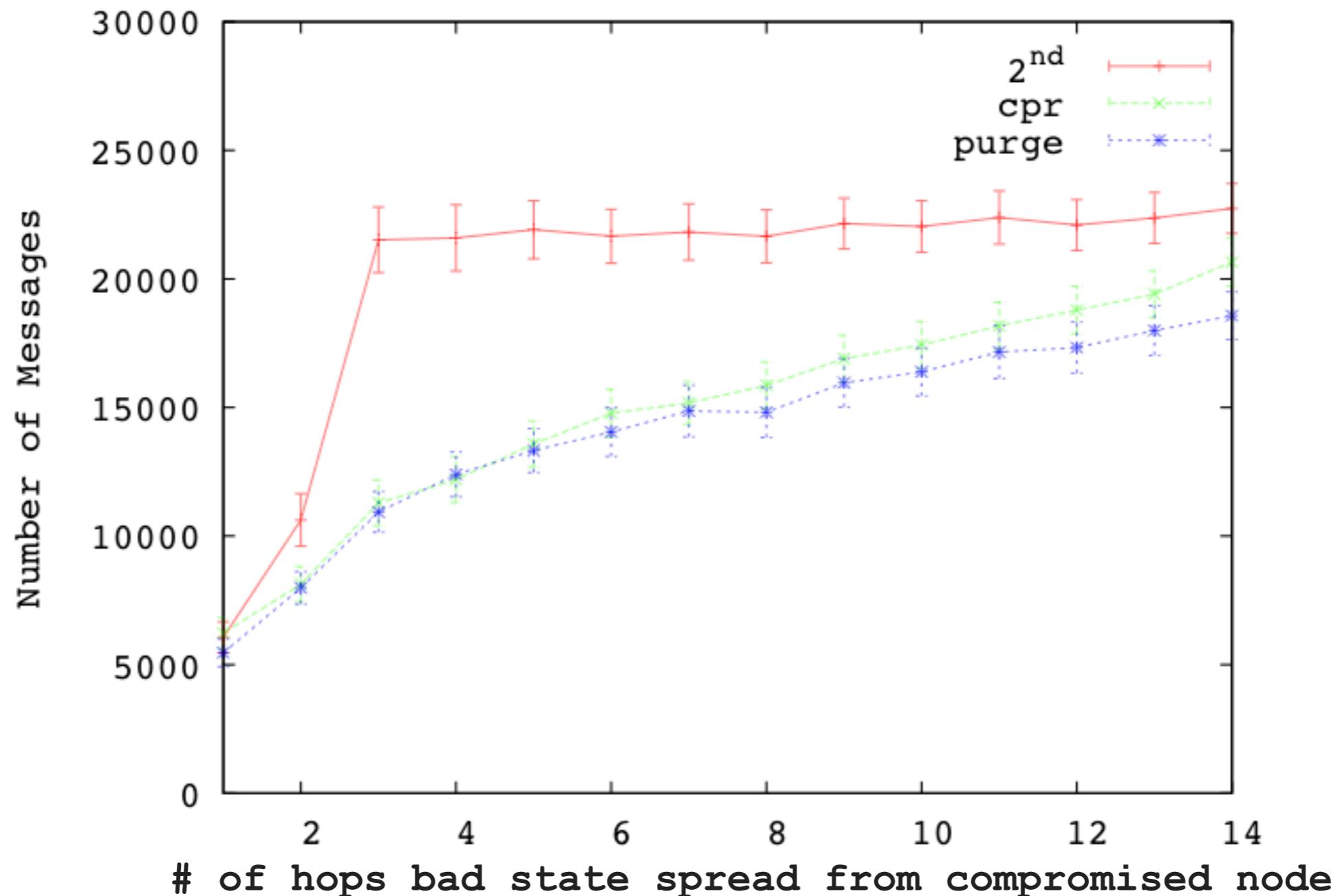
1. all nodes correctly compute least cost paths
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4. run recovery algorithm (messages counted here)

# Simulation Scenario

1. all nodes correctly compute least cost paths
2. a node is compromised and claims cost of “1” to every node
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- show results for Erdos-Renyi graphs
  - ▶  $n=100$ , link weights between  $[1, 100]$ , link weights can change after node compromised
  - ▶ same trends using Internet-like graphs (GT-ITM + Rocketfuel)

# Message Overhead



- 2ND BEST: many routing loops
- CPR: stale state after rollback + assumes synch clocks
- PURGE: no routing loops + no stale state during recovery

# Talk Outline

- thesis introduction
- placement of smart grid sensors to enable measurement error detection
- recovery from failed communication links in a smart grid
- recovery from malicious nodes injecting false routing state
- outline for future work and conclusions

# Thesis Summary

- consider failure of network components
  - ▶ router spreading false routing state
  - ▶ smart grid sensor measurement error
  - ▶ link failures in smart grid communication network
- proposed algorithms for automated recovery

# Contributions (1/3)

1. define 4 new problems for smart grid sensor placement that aim to max coverage + provide measurement error detection
  - ▶ prove each is NP-Complete
  - ▶ develop approximation algs + evaluate w/ simulations

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1. define 4 new problems for smart grid sensor placement that aim to max coverage + provide measurement error detection
  - ▶ prove each is NP-Complete
  - ▶ develop approximation algs + evaluate w/ simulations

# Contributions (2/3)

2. define problem of recovery from link failure in smart grid communication network
  - ▶ outline OpenFlow-based link failure detection algorithm
  - ▶ outline 3 algs to compute backup multicast trees

# Contributions (3/3)

3. design + develop 3 new algorithms for recovery from injection of false state in distributed sys.
  - ▶ evaluate w/ simulations + derive complexity bounds

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3. design + develop 3 new algorithms for recovery from injection of false state in distributed sys.
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Gyllstrom, Vasudevan and Kurose, IFIP Networking 2010

# Ch 2: Future Work Milestones

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  - ▶ implement using Frenetic OF controller

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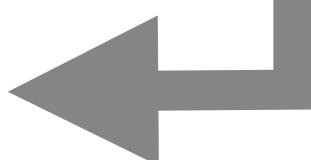
- link failure detection
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  - ▶ test + profile using Mininet

# Ch 2: Future Work Milestones

- link failure detection

5 weeks - March

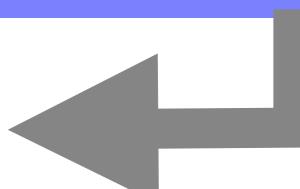
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- ▶ test + profile using Mininet

4 weeks - April

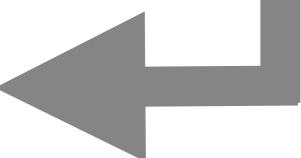
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- 5 weeks - March
- 4 weeks - April
- 

# Ch 2: Future Work Milestones

- link failure detection
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- backup tree computation algorithms
  - ▶ specify each algorithm

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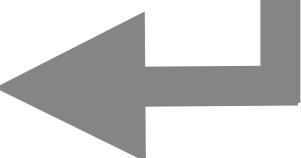


4 weeks - April

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- link failure detection
  - ▶ implement using Frenetic OF controller
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- backup tree computation algorithms
  - ▶ specify each algorithm
  - ▶ implement subset (?) of the 3 algorithms using POX Openflow controller

5 weeks - March

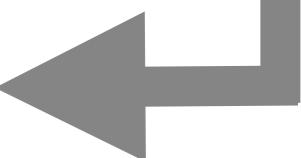


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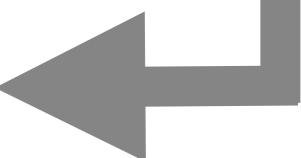


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  - ▶ specify each algorithm
  - ▶ implement subset (?) of the 3 algorithms using POX Openflow controller
  - ▶ complexity analysis
  - ▶ simulation-based evaluation using Mininet

5 weeks - March



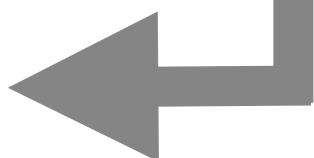
4 weeks - April

# Ch 2: Future Work Milestones

- link failure detection

5 weeks - March

- ▶ implement using Frenetic OF controller



- ▶ test + profile using Mininet

4 weeks - April

- backup tree computation algorithms

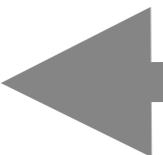
- ▶ specify each algorithm

4 weeks - May

- ▶ implement subset (?) of the 3 algorithms using POX Openflow controller

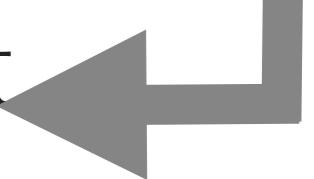
4 weeks - June

- ▶ complexity analysis



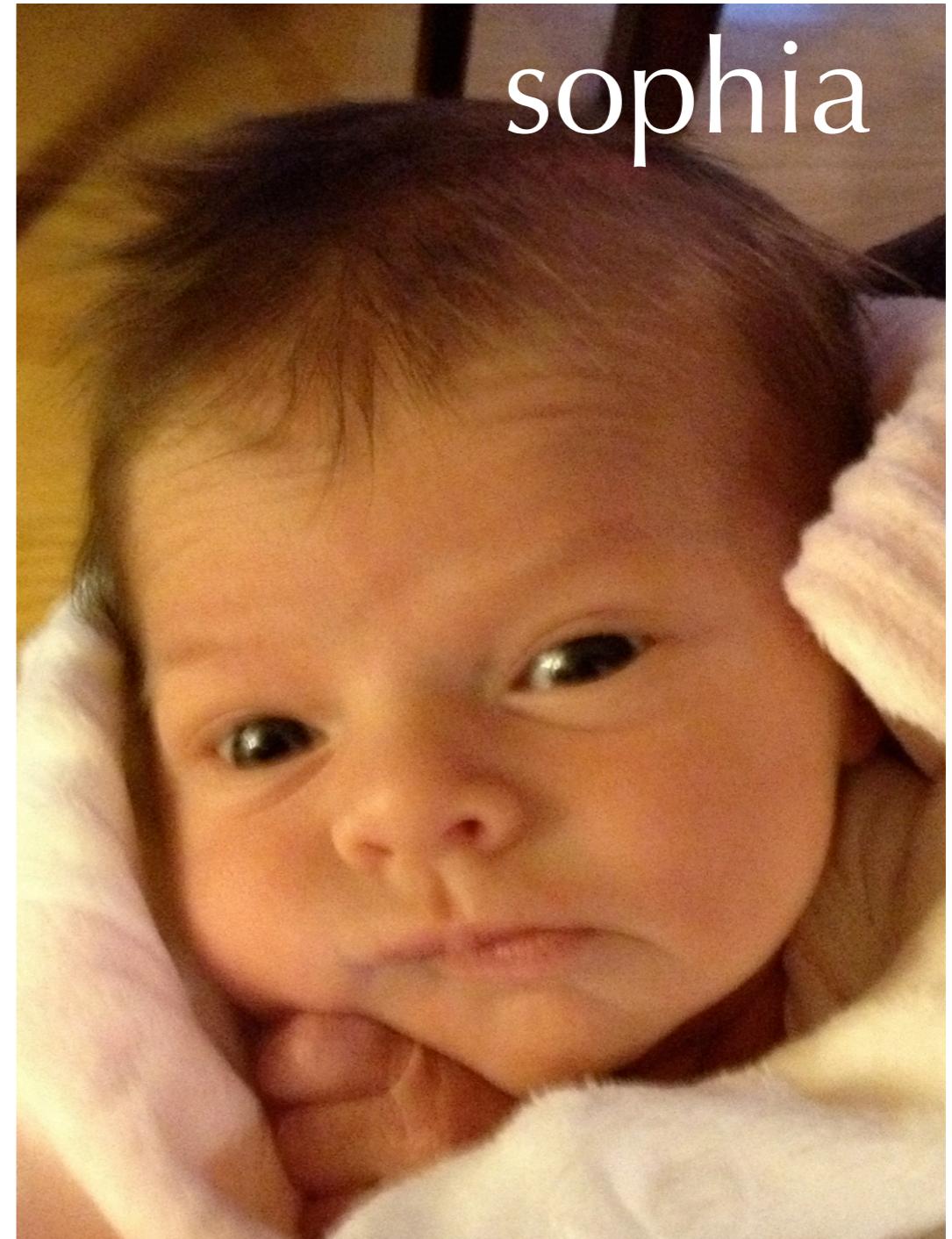
8 weeks - May

- ▶ simulation-based evaluation using Mininet



End of Technical  
Content

# Thank You Family



# Thank You Family

sisters + niece

dad



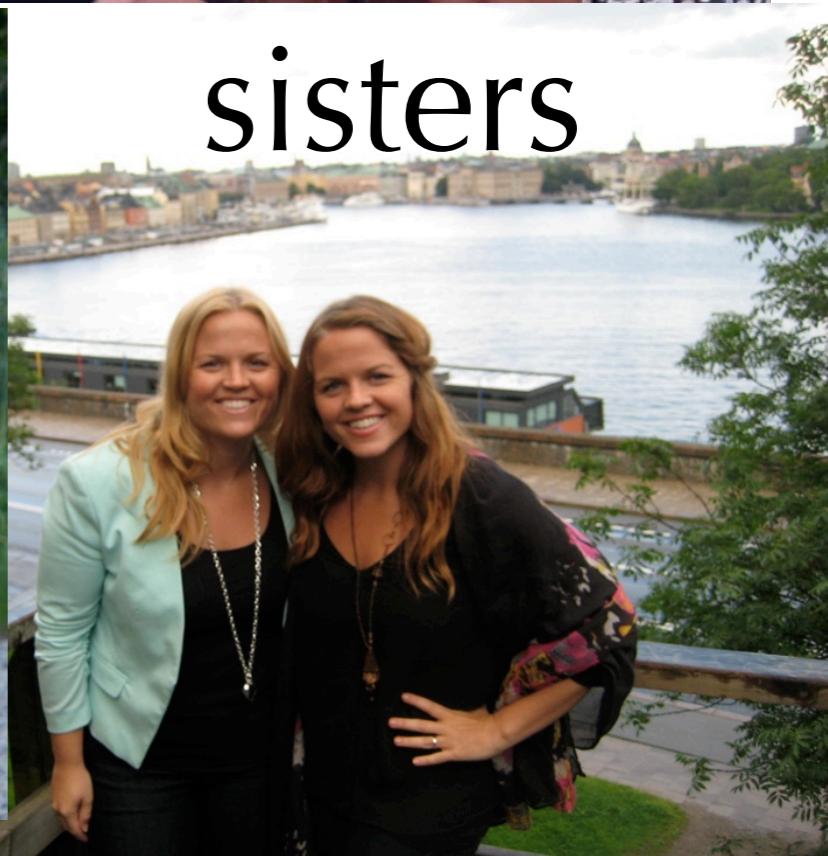
??



mom



sisters



# Quick Story

“Computer networking is boring, I’ll never work in that field”

-- Dan Gyllstrom, circa 2002

# Quick Story

“I’m not sure if this PhD program is for me, I have no advisor and no research prospects. I’ll sit-in on this graduate networking course”

-- Dan Gyllstrom, early Fall 2007

# Quick Story

“This is the best class I have ever taken, I  
need to work with Jim Kurose ”

-- Dan Gyllstrom, mid-Fall 2007

# Thank You Jim



Picture courtesy of Pablo Serrano and the 1980s

# Thank You Committee



# Thank You Colleagues + Friends

- NETWORKS Lab
- GEF: Marwan Mattar, Karl Gyllstrom
- Donald Knuth for the fruitful discussions

Finally, thank you all  
for coming.

Questions?

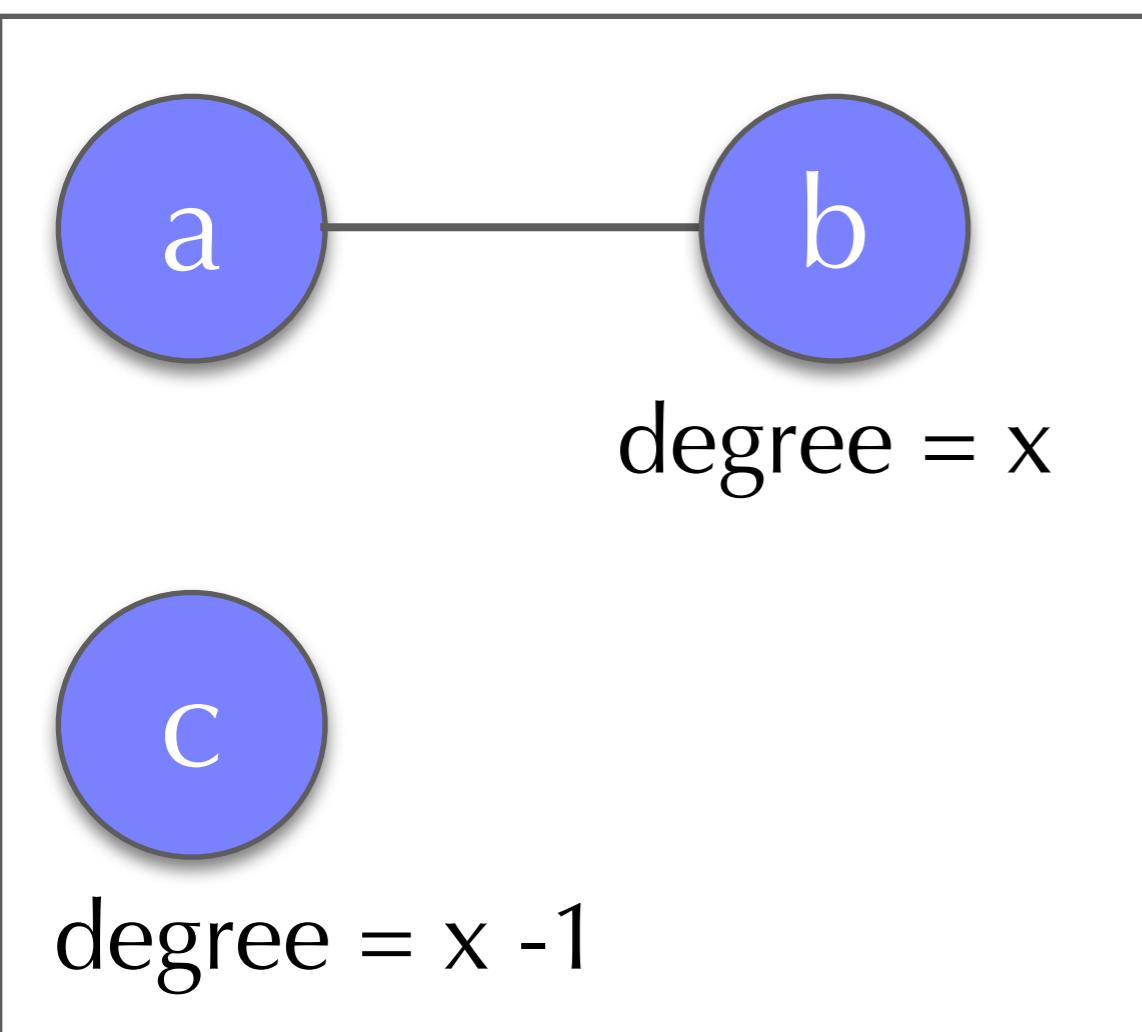
Comments?

# Backup Slides

# Ch 1: Synthetic Graph Generation

1. start with IEEE graph
2. swap edges until new graph shares no edges with original

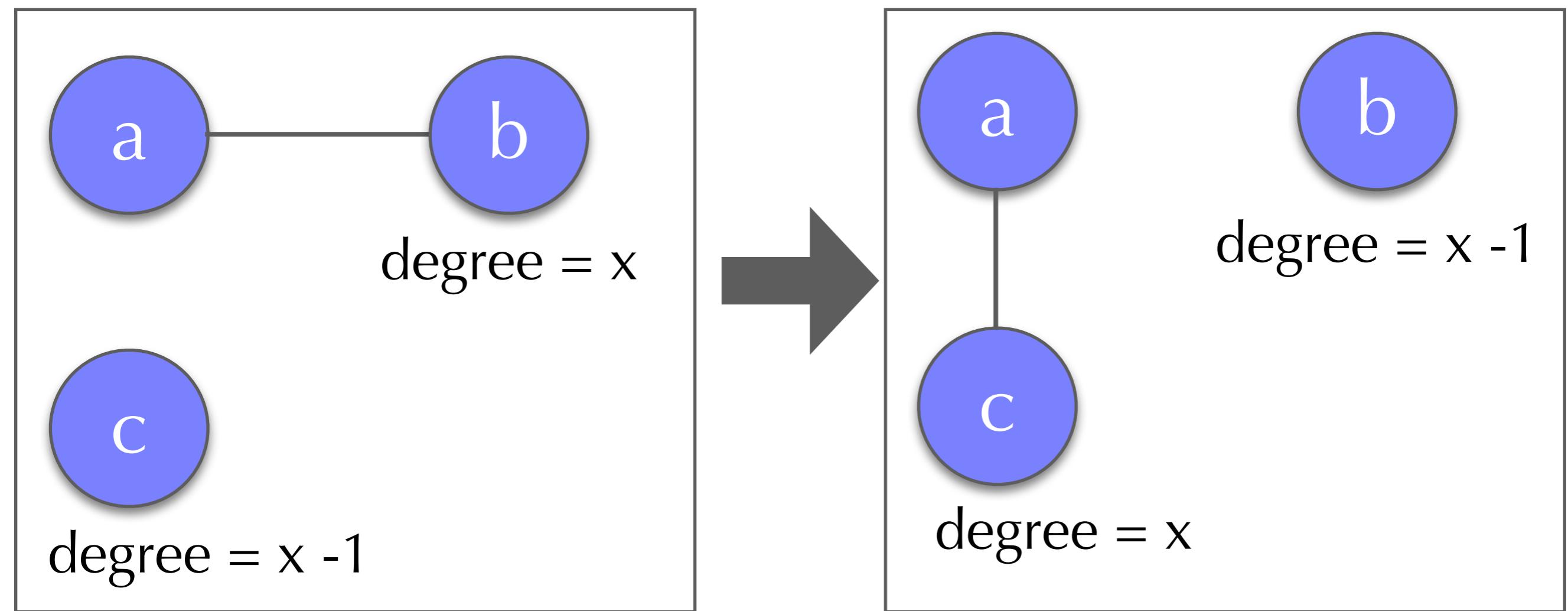
Output = same # number of nodes but new connectivity



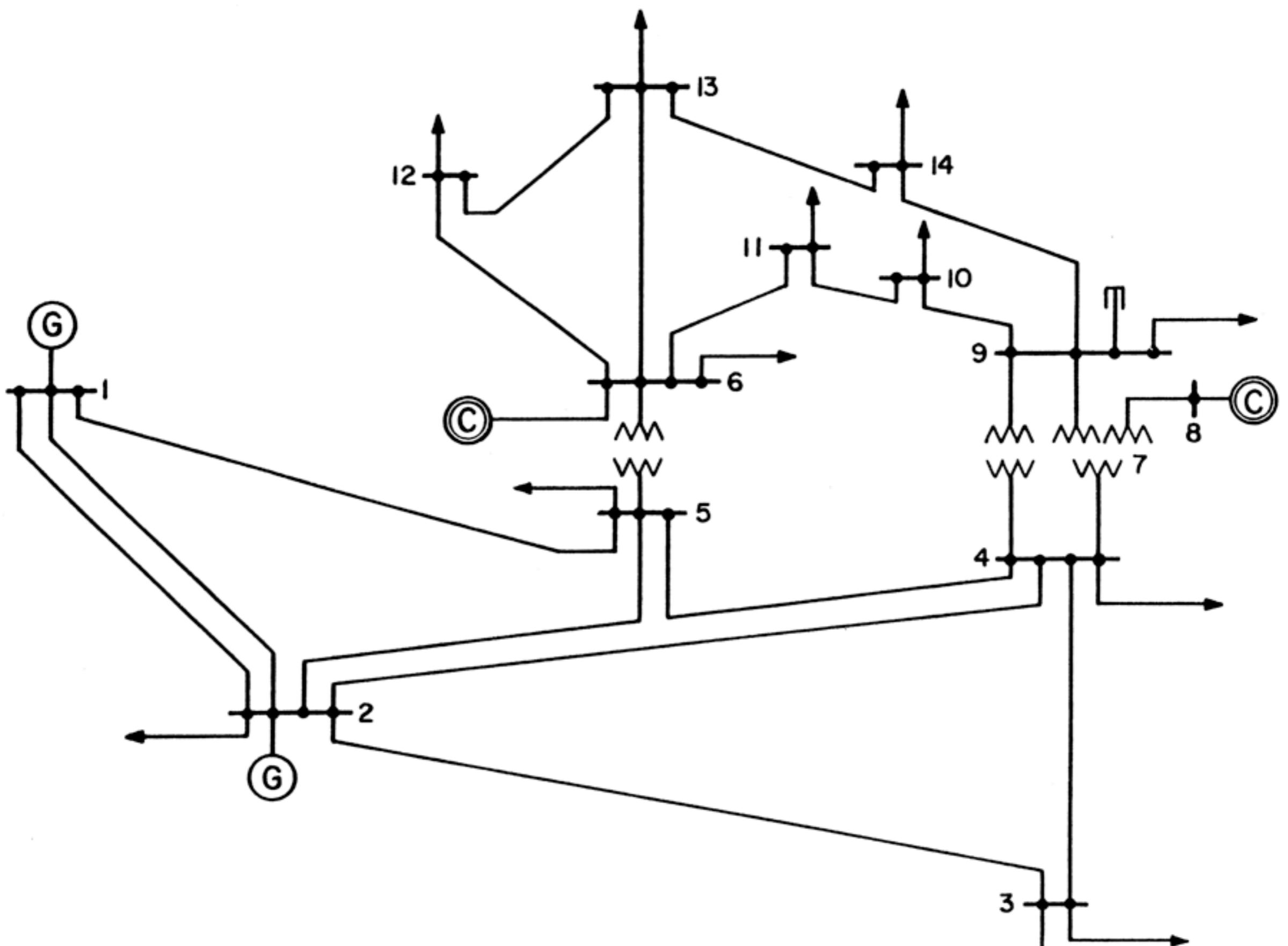
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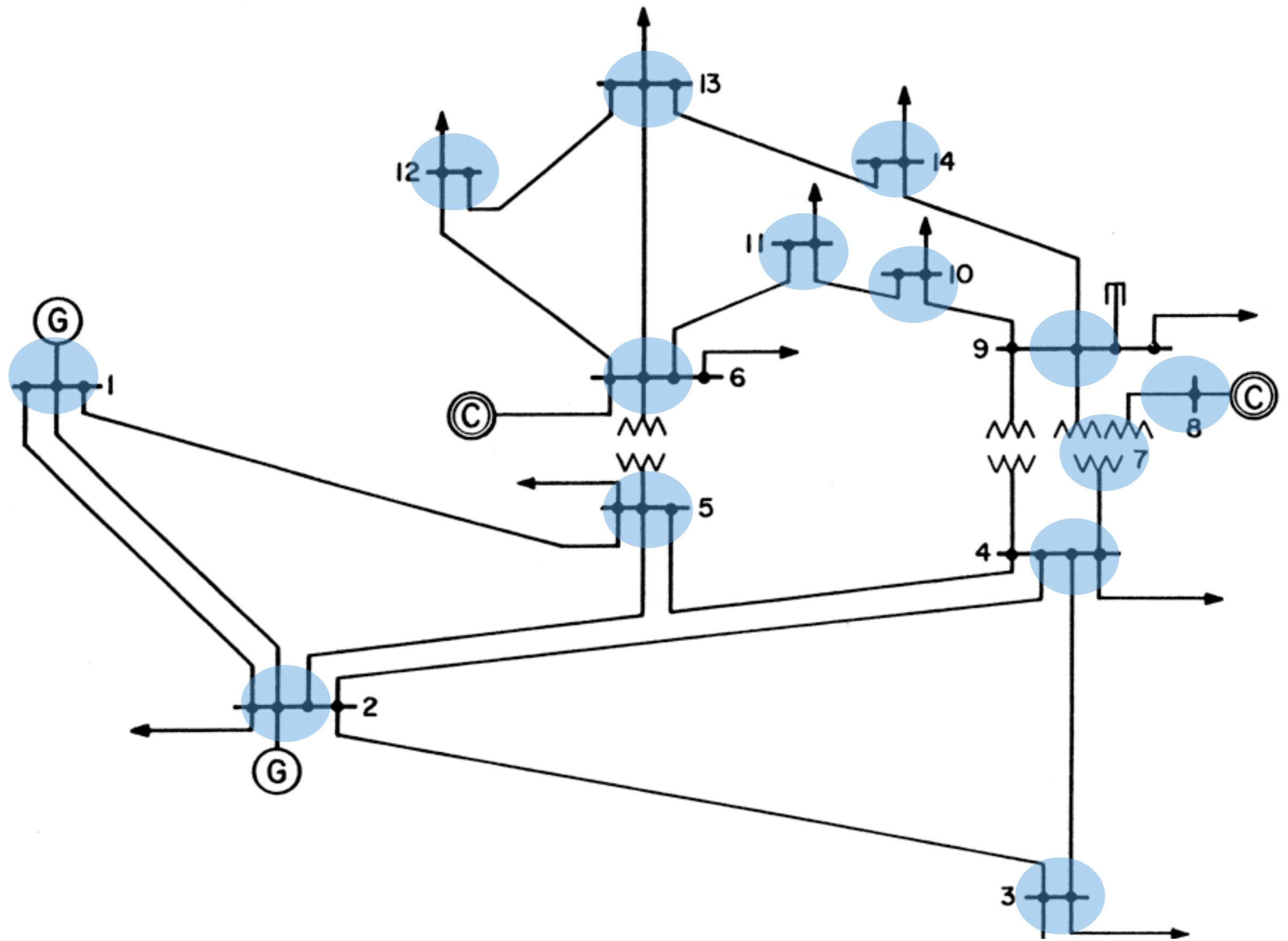
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# Ch 1: IEEE Bus System 14

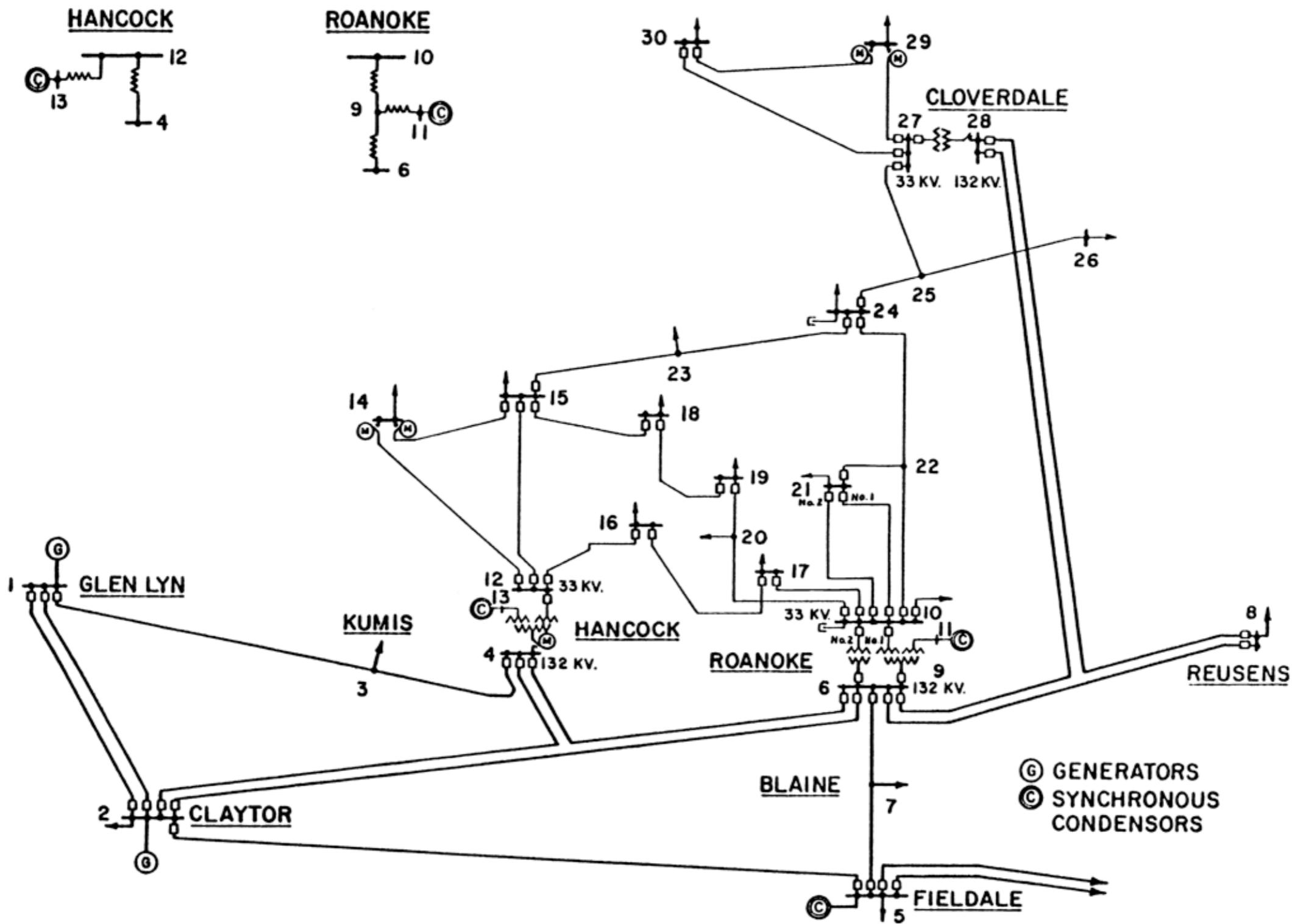


# Ch 1: IEEE Bus System 14



# Ch 1: IEEE Bus System 30

## THREE WINDING TRANSFORMER EQUIVALENTS



# Ch 1: Power Grid Terminology

- Node: system bus
  - ▶ injection node: power generation center or aggregation of loads
  - ▶ zero-injection node: substation where electrical lines meet (maintains conservation of flow)
- Observed: if voltage phasor of node can be directly measured or calculated

# Ch 1: Zero-Injection Nodes

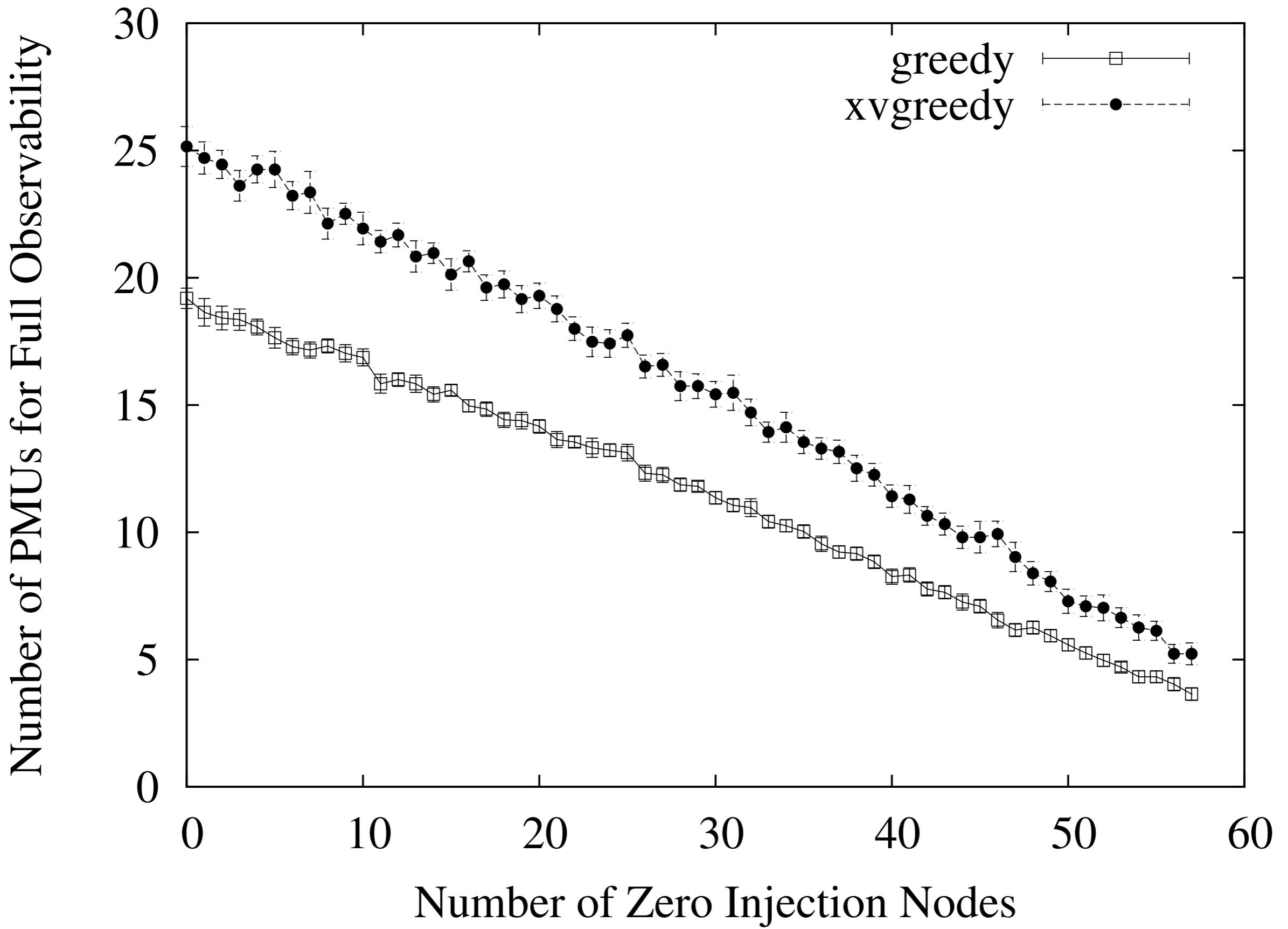
- Zero-Injection Node
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  - ▶ node must be zero-injection to apply Observability Rule 2

# Ch 1: Zero-Injection Nodes

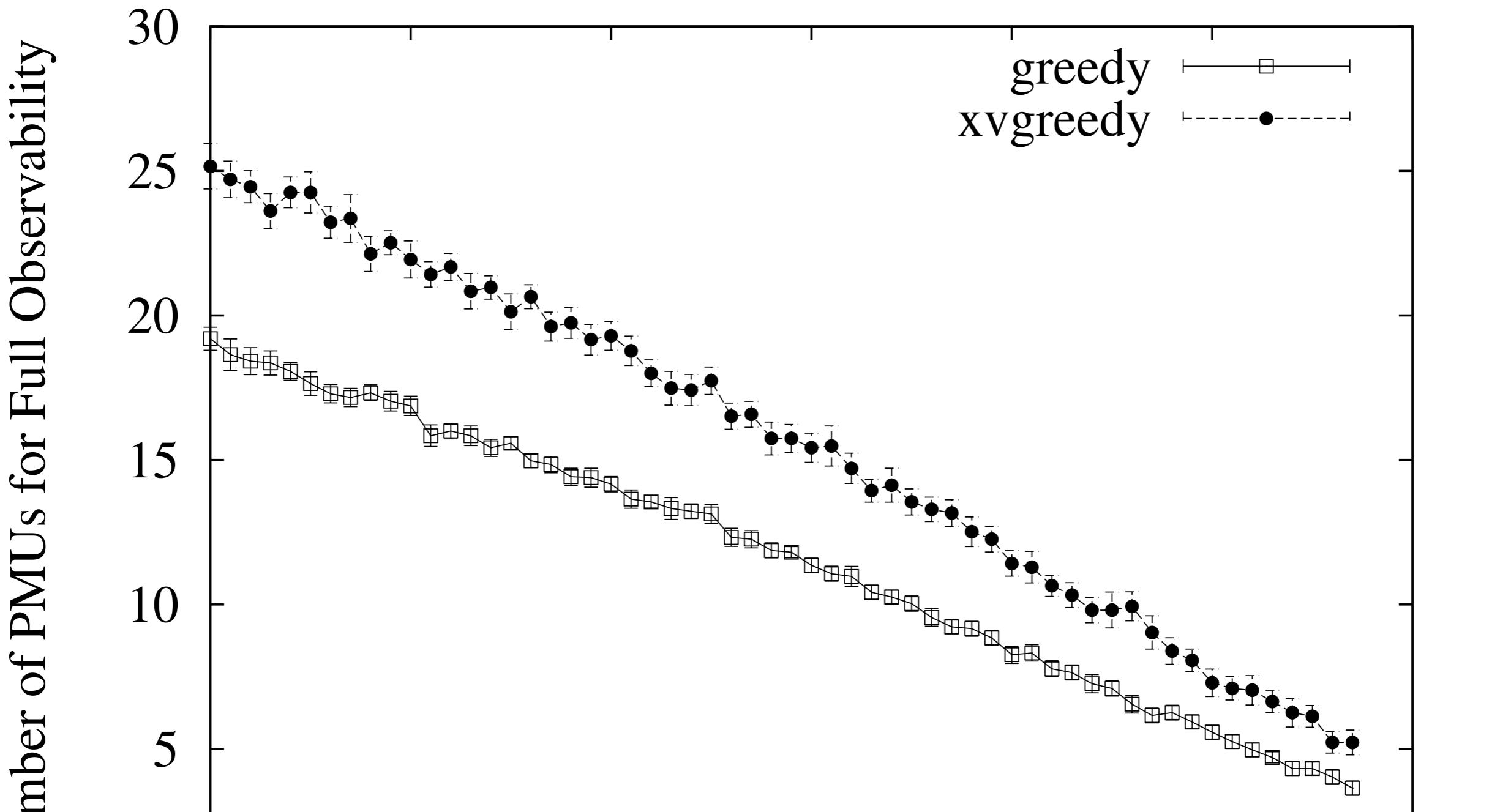
- Zero-Injection Node
  - ▶ substation where electrical lines meet
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  - ▶ node must be zero-injection to apply Observability Rule 2

How does # of zero-injection nodes effect observability?

# Ch 1: Vary # Zero-Injection Nodes



# Ch 1: Vary # Zero-Injection Nodes



more zero-injection nodes reduces # of PMUs needed to observe all graph nodes

# Ch 1: Why is XV Limited to 2 Hops?

- Computing voltage phasor of non-PMU nodes
  - ▶ equations have variables to account for measurement error
- More than 2 Hops
  - ▶ have more unknowns than equations  
=> no error detection

# Ch 2: More Related Work

- OpenFlow-based solution by Kotani et al. [33]
  - ▶ pre-install backup MT
  - ▶ packet headers carry tree ID to indicate which tree to use
    - after link failure, root writes tree ID of backup tree in each packet header
  - ▶ (+) promising approach to fast tree switching
  - ▶ (-) basic MT computation (Dijkstra's algorithm)

# Ch 2: Packet Loss or Delay?

- goal: minimize packet loss and delay related to link failure
  - ▶ consider any packet not meeting its E2E delay requirement as lost
    - critical power grid applications: no tolerance for loss
  - ▶ link failure detection
    - OpenFlow no native timer support
    - use loss as indicator of delay

# Ch 2: More on Backup MTs

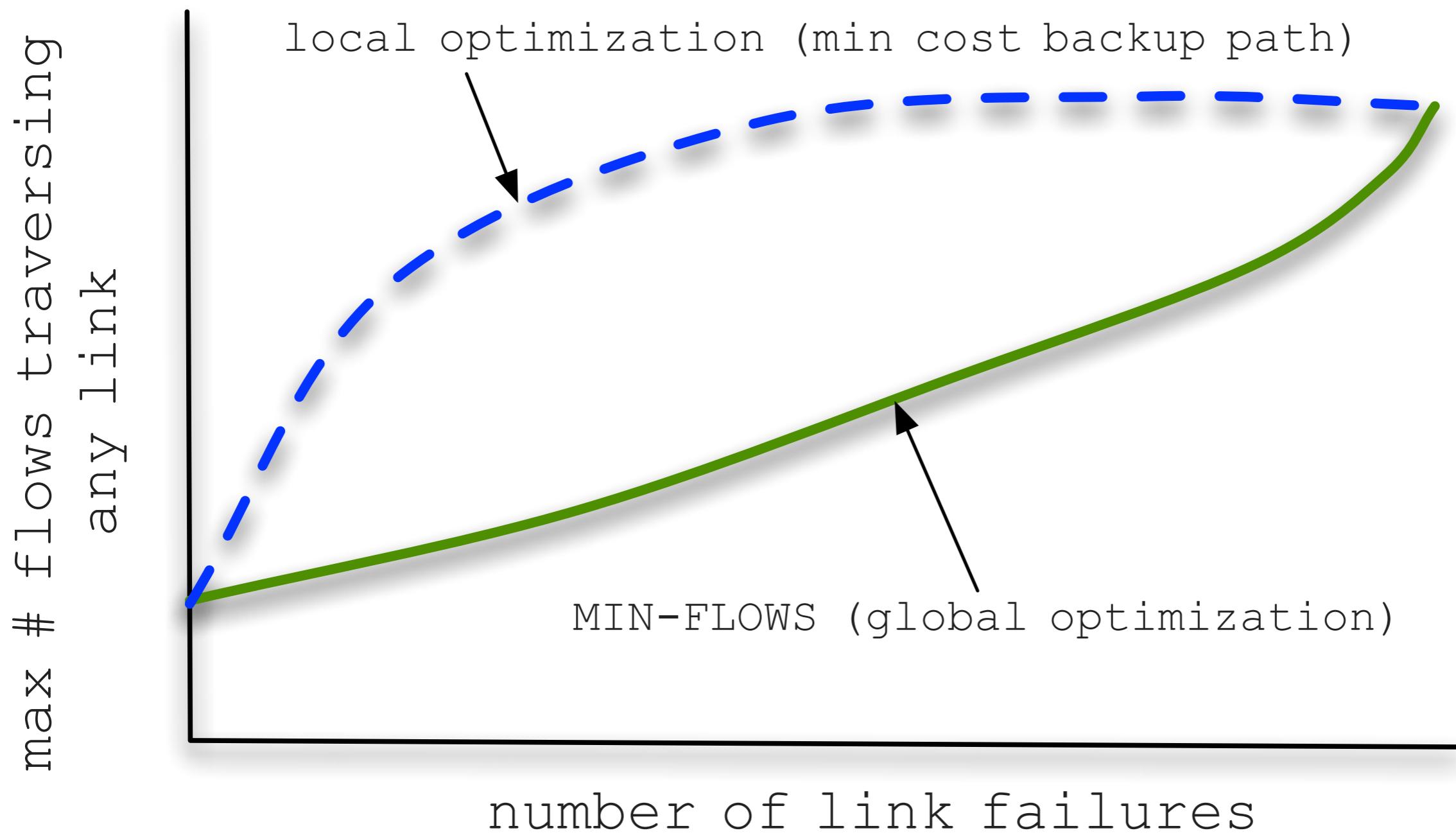
- how many?
  - ▶ for each MT: compute backup MT for each link
- when are backup MTs computed?
  - ▶ initialization
  - ▶ recompute *all* backup MTs after each link failure
    - state of network changes after each failure

# Ch 2: Research Questions

Q3: How much more does global optimization increase robustness than doing localized opt.?

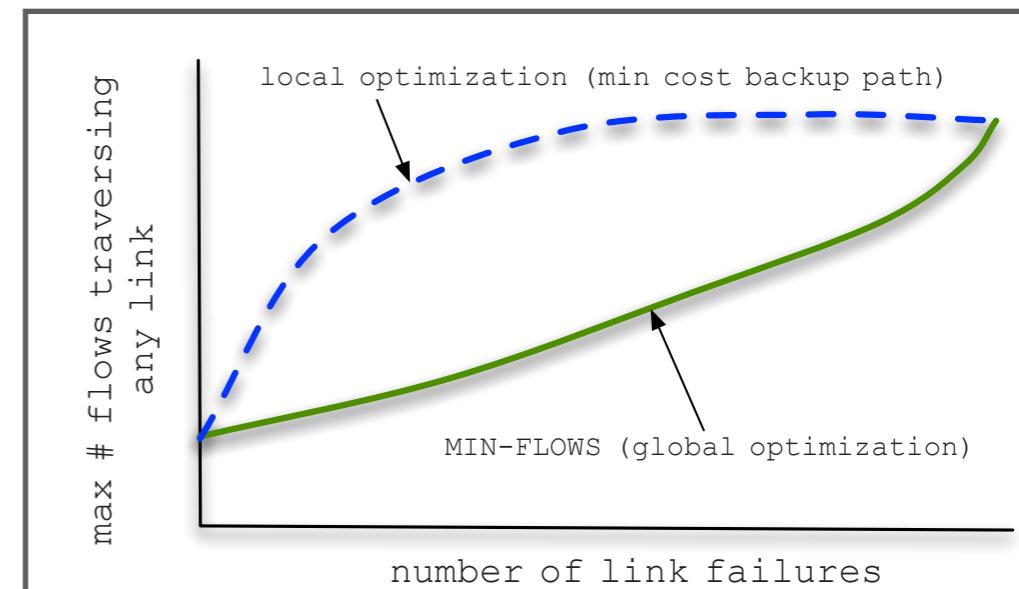
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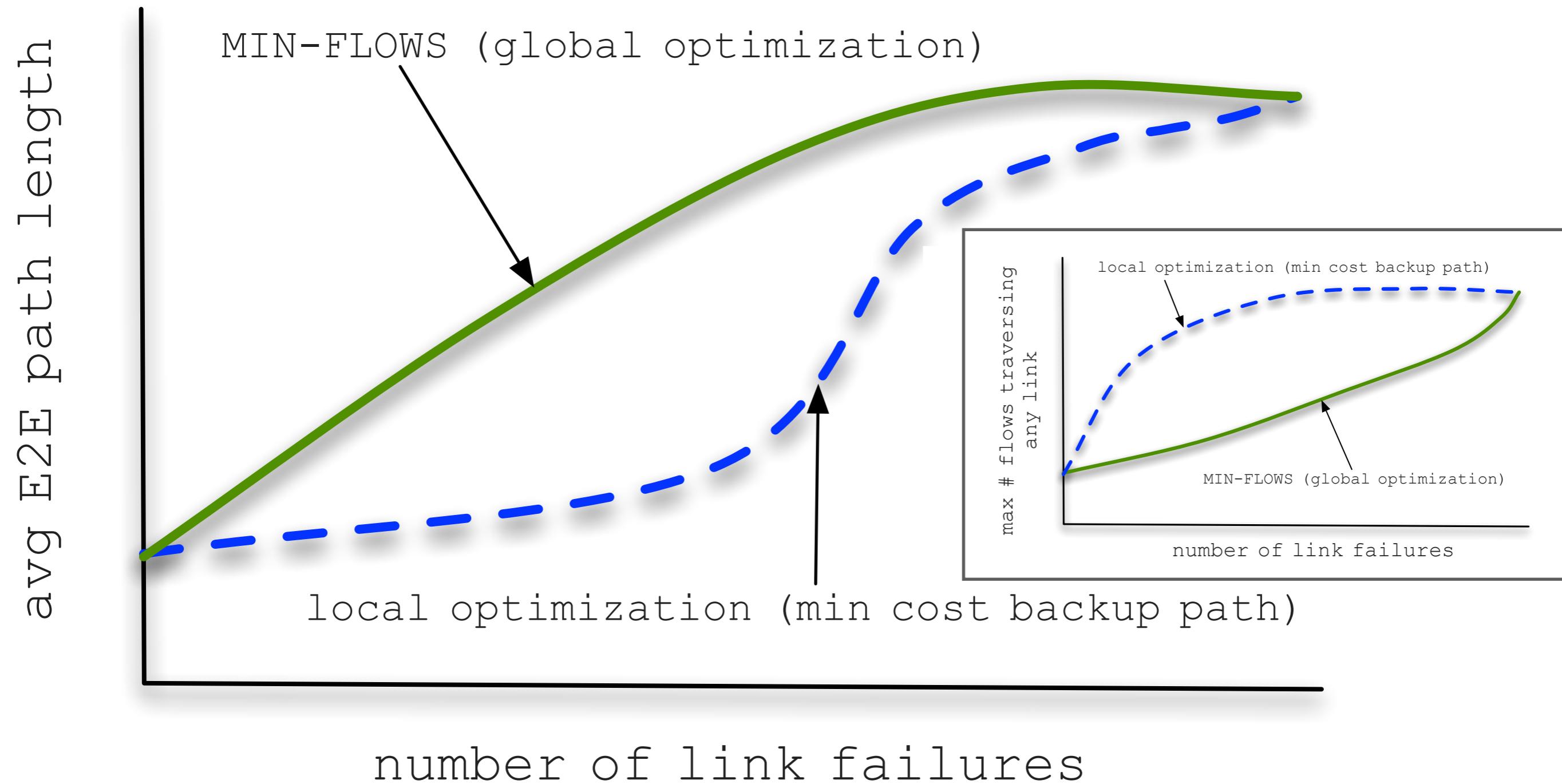
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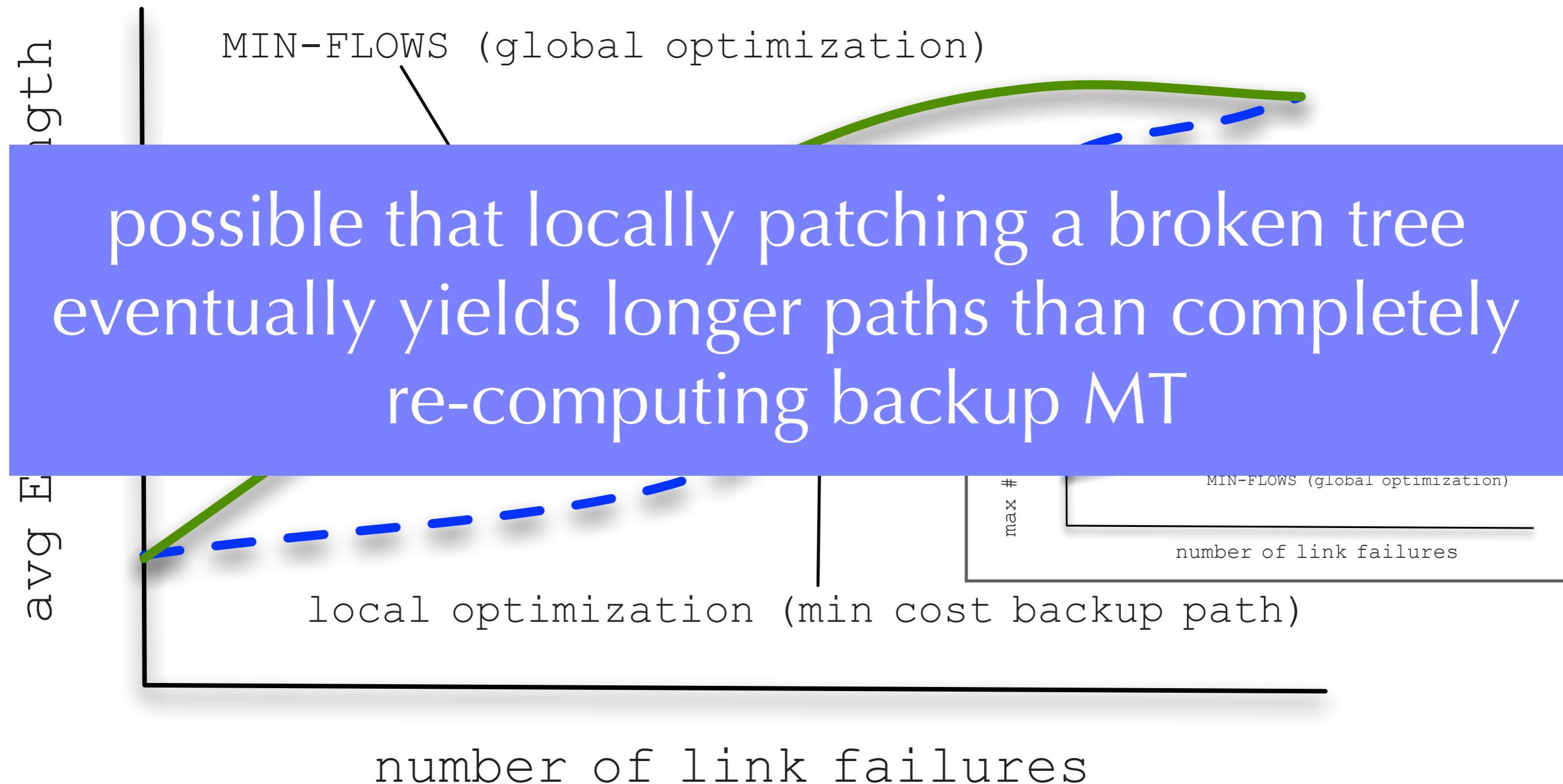
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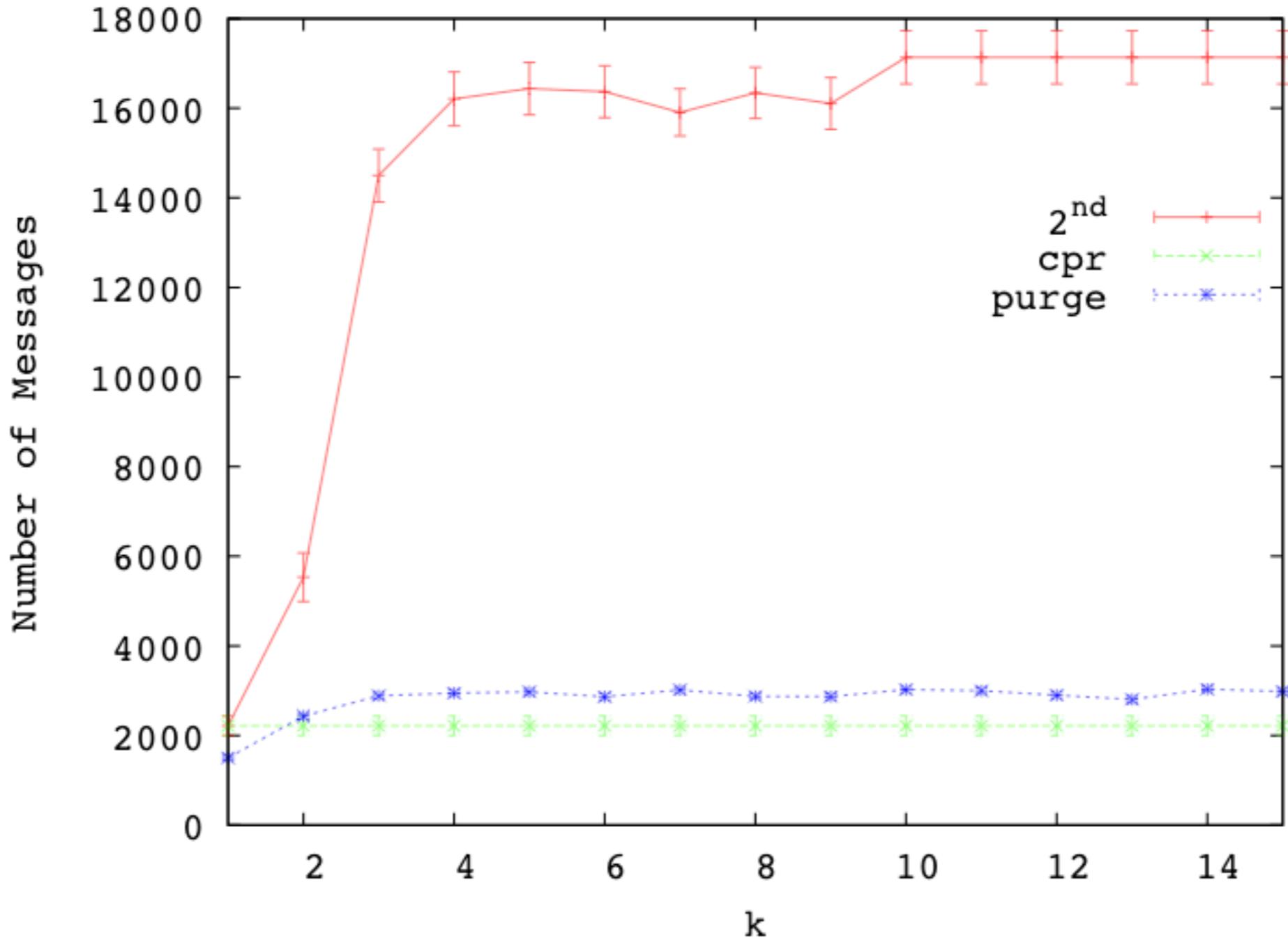


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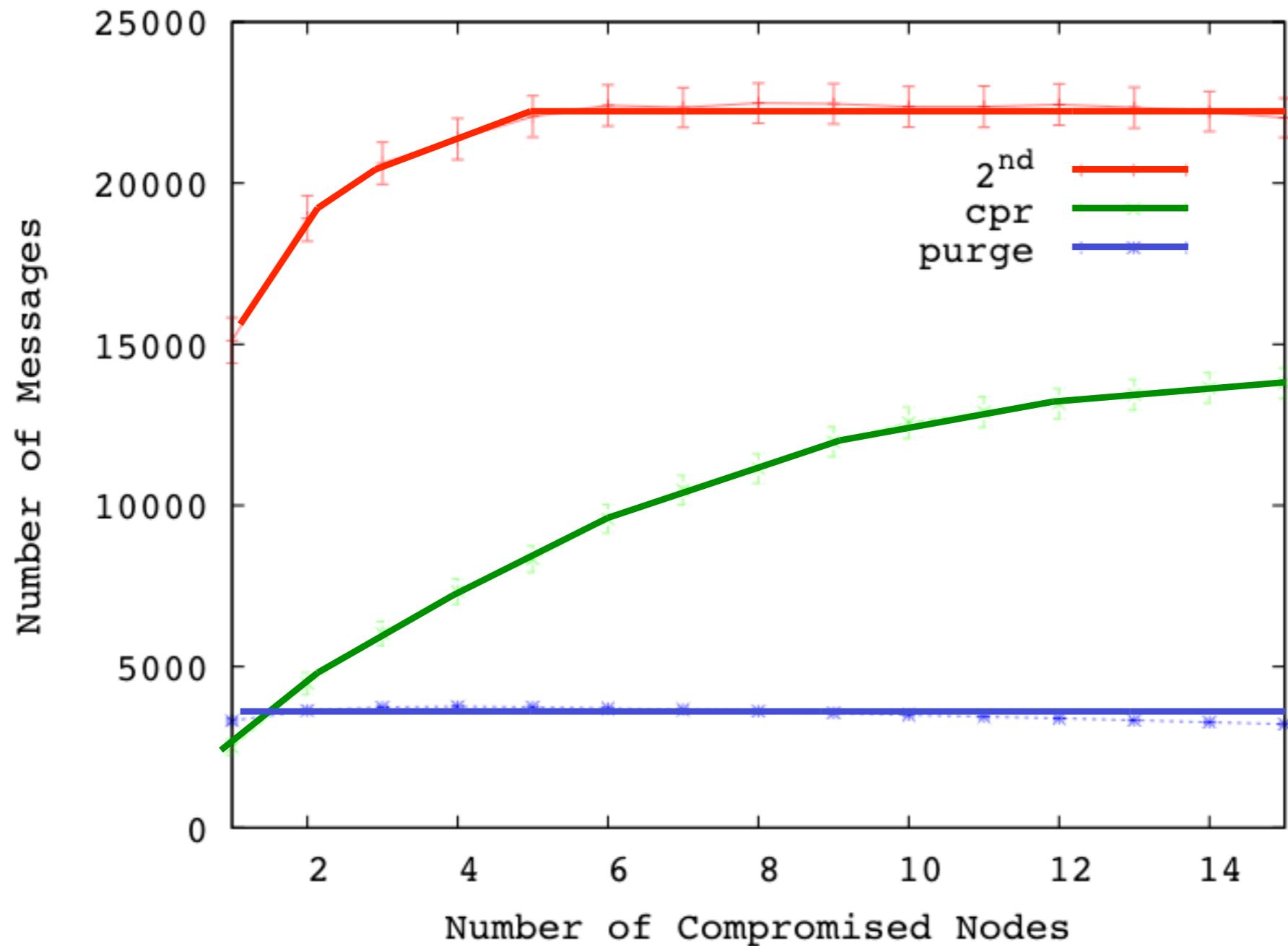


# Ch 3: Fixed Link Cost Graphs



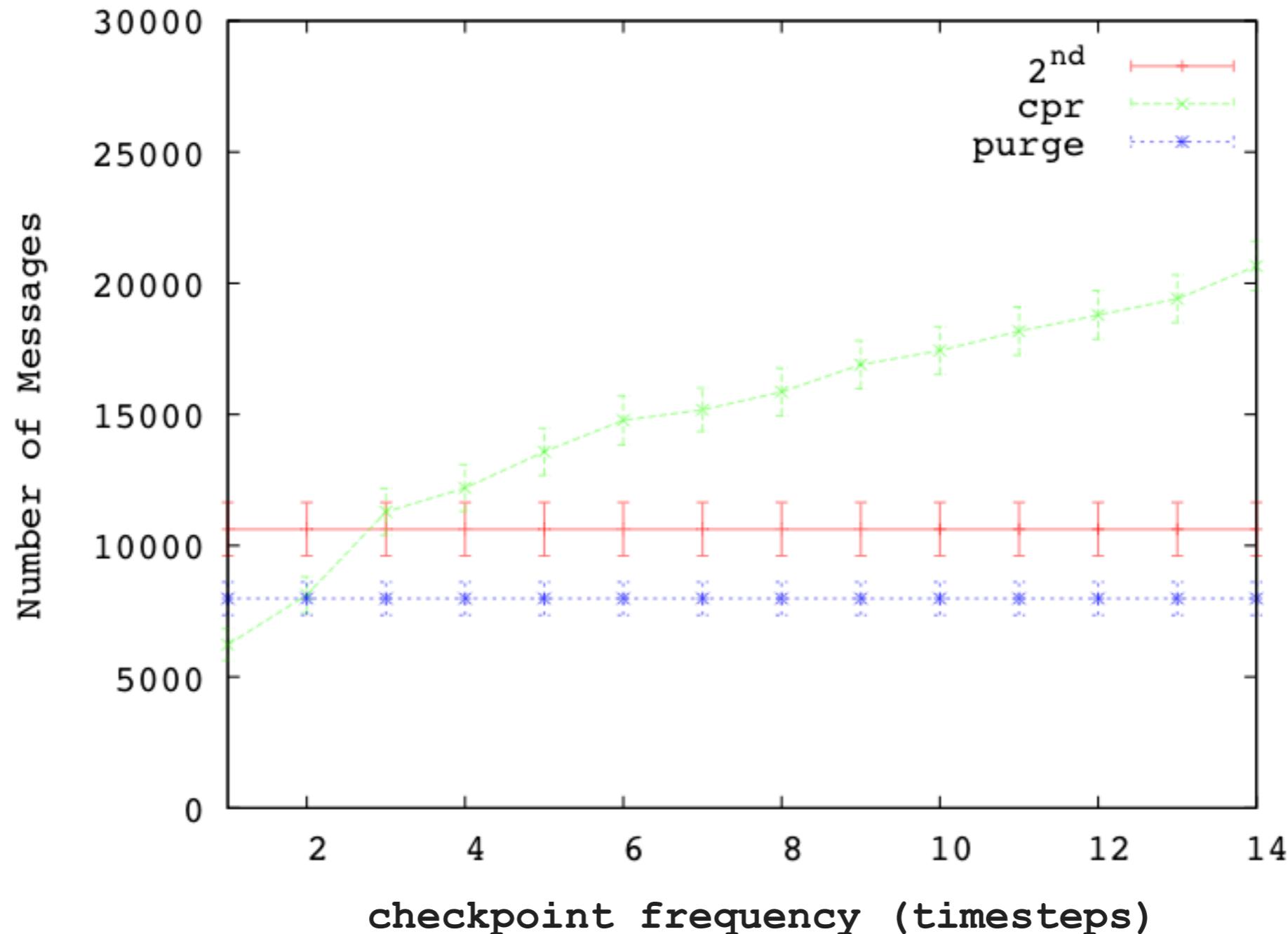
- 2ND BEST: many routing loops
- CPR: removes state with checkpoint and rollback
- 2ND BEST and PURGE: use iterative distance vector

# Ch 3: Multiple Compromised Nodes



- 2ND BEST: many routing loops
- CPR: much stale state after rollback => routing loops
- PURGE: no routing loops + no stale state

# Ch 3: Setting Checkpoint Frequency



- CPR: less frequent checkpoints => more overhead
- 2ND BEST and PURGE: constant overhead b/c neither algorithm checkpoints

# Ch 3: Detecting Compromised Node

- detection is out of scope
  - ▶ output of detection algorithm is input to our recovery algorithms
- our algorithms work independent of detection algorithm
- some compromised node detection algorithms named in the report [22, 23, 25, 46]
  - ▶ Feamster et al. “Detecting BGP Configuration Faults with Static Analysis” [23]
  - ▶ K. School et al. “Context Aware Detection of Selfish Nodes in DSR based Ad-hoc Networks” [46]

# Ch 3: Open Questions

1. what is the “worst” false routing state
  - considered case of vector of all ‘0’ distances
    - ▶ easy to detect
  - false state that is easier to disguise?
  - state that maximizes count-to-infinity problem
2. algorithm performance over IEEE Bus Systems