

# Enhancing Scalability and Liquidation in QoS Lightning Networks

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# Outline

1. Blockchain and Lightning Networks
2. QoS: Scalability and Liquidation
3. Supernode-based Clustering
4. Pooling and Pruning
5. Performance Evaluation
6. Future Work



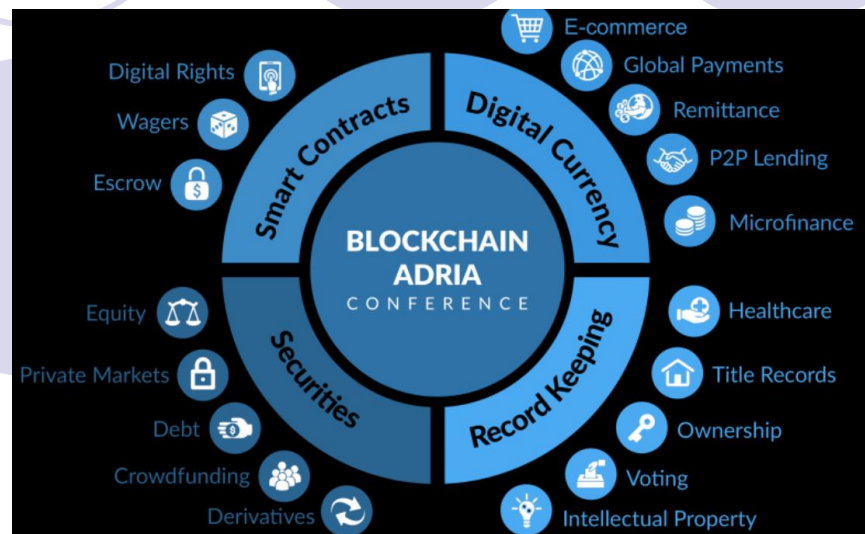
# 1. Blockchain and Lightning Networks

- Blockchain

- A system of maintaining transactions in a P2P network
- Distributed ledger

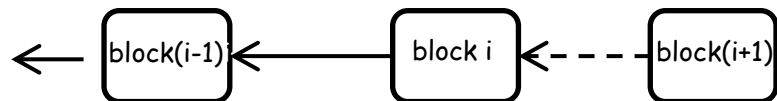
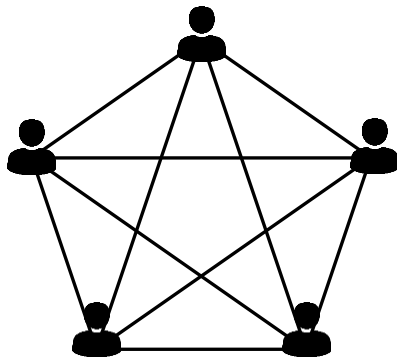
- Bitcoin

- Bartering
- Metallic money
- Paper money
- Cryptocurrencies



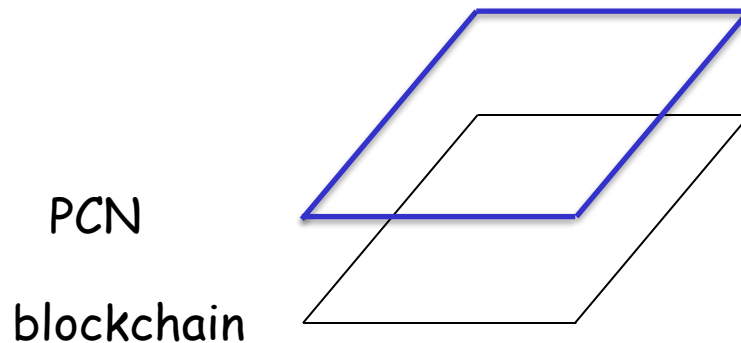
# Blockchain Basics

- Components
  - Transaction/block, incentive, and consensus
- PoW-based blockchain mining
  - Mining a block: puzzle solving (Nakamoto protocol)
  - PoW: Prob. of solving a puzzle (computing rate)
  - Individual chaining of blocks



# Blockchain Scalability

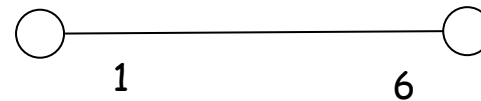
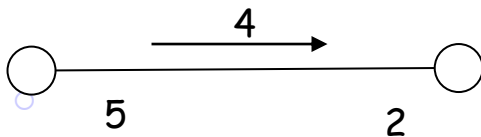
- Scalability problem
  - 10 minutes per block (1 MB) or  $\leq 7$  transactions per second
- Solutions
  - On-chain: block-size, sharding, other consensus (PoS/PoC)
  - Off-chain: SegWit, side chain, and tree chain
- Payment channel network (PCN): layer 2



# Lightning Networks (LNs)

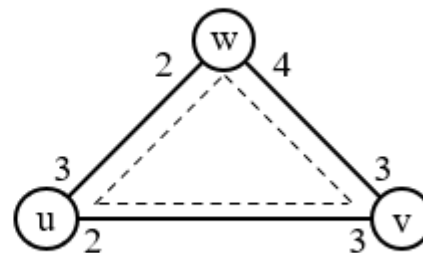
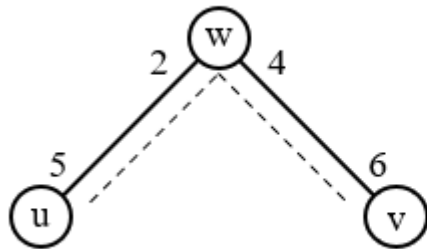


- Micropayment channels
  - Quick transactions between **trusted neighbors**
  - Avoiding block confirmation via **off-chain payment**
- Fund allocations
  - Allocation of node funds to channels
- Bidirectional transactions
  - Fund balance in two directions: **channel capacity**
  - Channel balance of two sides are **private**



# Payment Path

- Indirect fund transfer
  - Between two untrusted neighbors
- Payment path
  - A sequence of non-repeated trusted neighbors
- Types of paths
  - Single-path and multi-path
  - e.g., transfer \$4 from u to v



## 2. QoS: Scalability and Liquidation

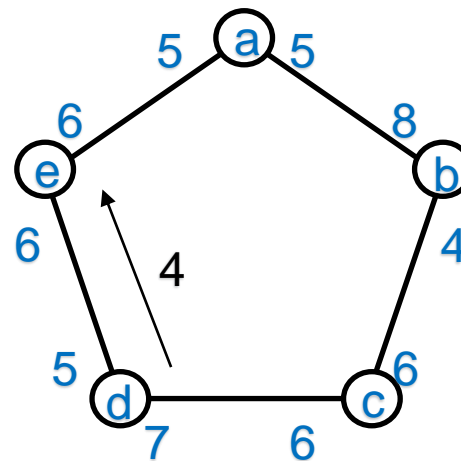
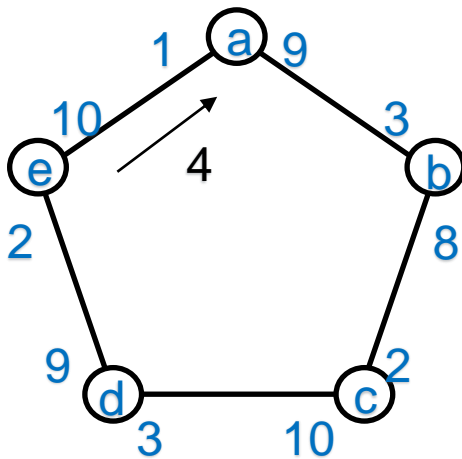
- **Scalability** for path searching
  - Searching process with global information
    - Route validation (for channel balance check)
- **Liquidation** for fund transfer
  - Success ratio for transactions
    - Alleviated with multi-path, but more involved

LN is dynamic: A change in topology or capacity is broadcasted



# Existing Solutions

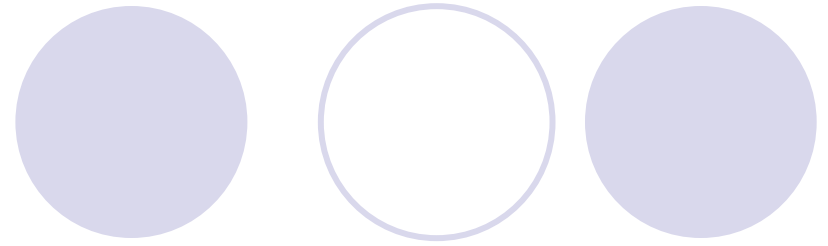
- Current scalability solution
  - Flare: reducing time to find a payment route
  - Challenges: large search space
- Current liquidation solution
  - Revive: rebalancing cycles
  - Challenges: fixed channel capacity



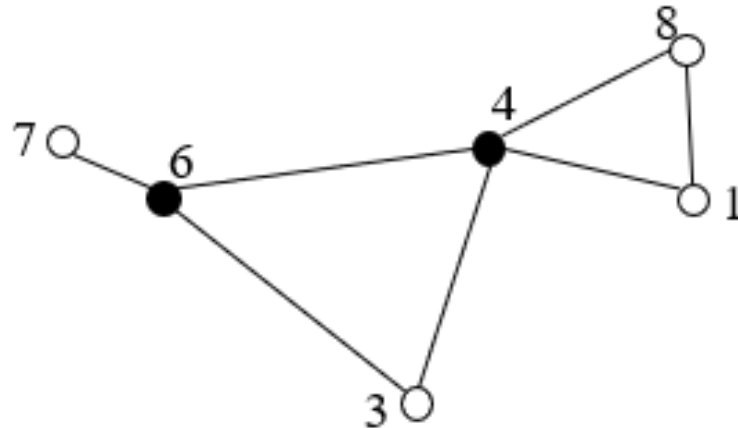
# 3. Supernode-based Clustering

- A special clustering approach
  - Addressing both scalability and liquidation
  - Graph  $G = (E, V)$  partitioned into clusters **locally** (why?)
- **Supernodes**  $S \subset V$ 
  - Each cluster is headed by a supernode
  - Being **locally self-connected** reduces update cost

# Clustering



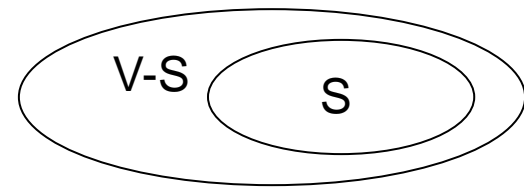
- Basic algorithm
  - Node  $v$  is clusterhead when  $v$  has two unconnected neighbors
- Property
  - Clusterheads form a locally self-connected dominating set (DS)
  - Low-efficiency: too many clusterheads (black nodes)



# 4. Pooling and Pruning

- Supernode selection ( $S$ )
  - Induced subgraph  $G[S]$  is connected and  $V-S \subseteq N(S)$

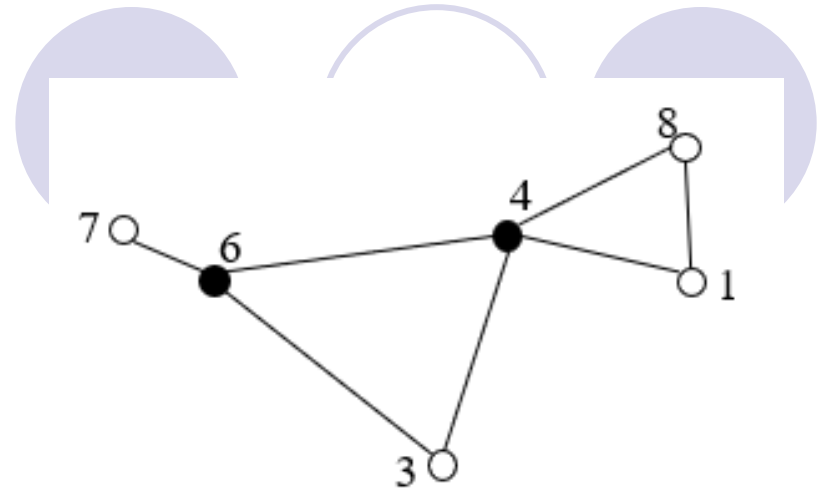
- Fund pooling by supernodes



- **Pooling** funds in all clusters
  - Redistributing funds to external channels in  $G[S]$
- Routing
    - Searching in a reduced space in  $G[S]$ , rather than  $G$

# Design Details

- Each node
  - Knows its  $k(=2)$ -hop info.
- Escrow Account
  - Each node has one **escrow account** for its supernode neighbor
- Fund allocations of supernodes
  - Use escrows to allocate more funds to external channels
- Implementation
  - **Local status calculation**, then status/link-state broadcasting



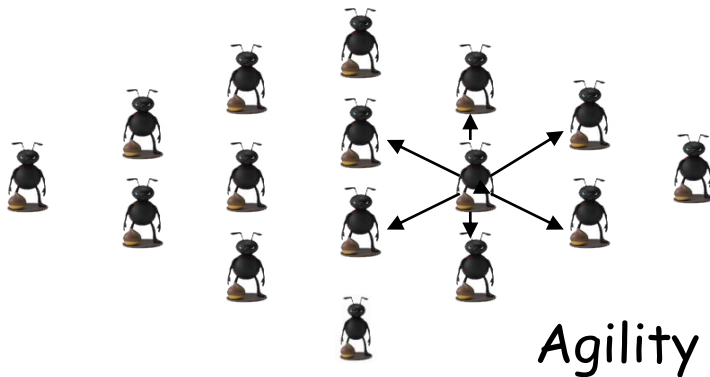
# Self-Organizing Local Solutions

## Local decisions/fixes Principles

- P2P and simple interaction (local w/o seq. propagation)

## Global functionality

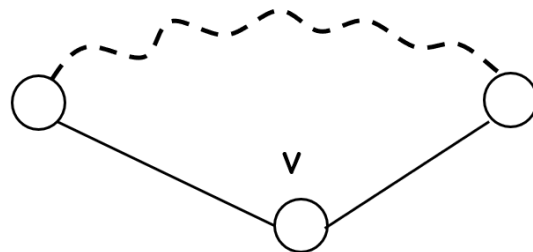
- E.g., connectivity



- $P_1$ : Local actions w/ global properties (scalability)
- $P_2$ : Minimization of maintained state (usability)
- $P_3$ : Adaptive to changes (self-healing)
- $P_4$ : Implicit coordination (efficiency)

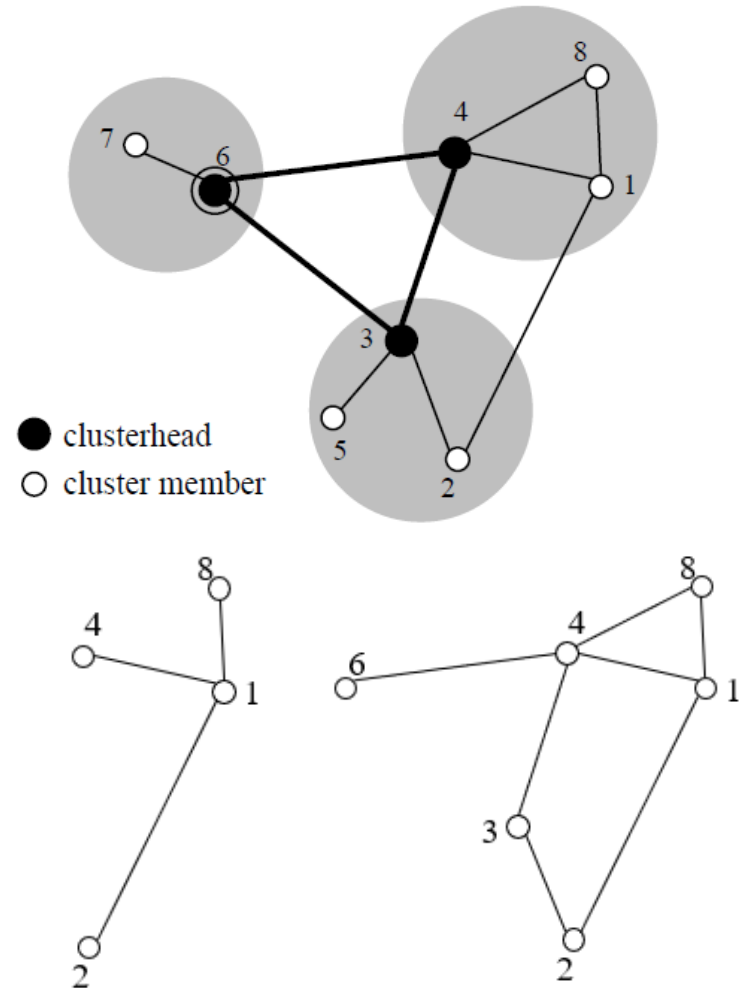
# Node Pooling

- Supernode selection (Wu and Dai 2004)
  - All nodes are initially supernodes
  - A supernode  $v$  becomes a **non-supernode** if any two neighbors of  $v$  are connected by a path (under  $k$ -hop view,  $k=2$ ) such that for each intermediate node  $u$  in the path,  $Pri(u) > Pri(v)$
- Time complexity:  $O(\Delta^2)$ , where  $\Delta$  is max node degree



# Supernode Selection

- Node  $v$ 
  - 2-hop local view
  - A distinct priority  $Pri(v)$
- Supernode set
  - $S = \{3, 4, 6\}$
- Node 1's view
  - 1-hop view
  - 2-hop view



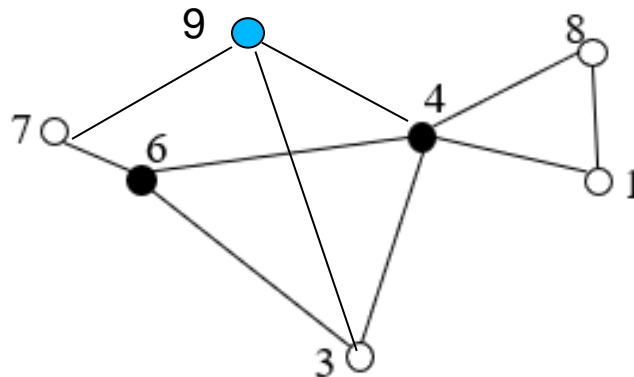


# Network Dynamics

- Nodes joining/leaving (channels up/down)
  - Local update (2-hop): no propagation
  - Supernode stability: **graceful evolving** clustering

**Theorem:** When a node is added to/deleted from an LN, it will only affect the status of k-hop neighborhood of the node.

e.g., deleting 3 changes no node & adding 9 changes 6 to a regular node



# Link Pruning

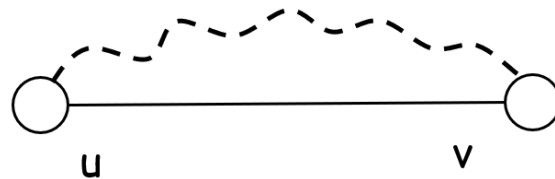
- Link Priority

- Reserve lexicographical order for link  $uv$

$\text{Pri}(\max\{\text{Pri}(u), \text{Pri}(v)\}, \min\{\text{Pri}(u), \text{Pri}(v)\})$ , e.g.,  $\text{Pri}(3, 2) > \text{Pri}(3, 1)$

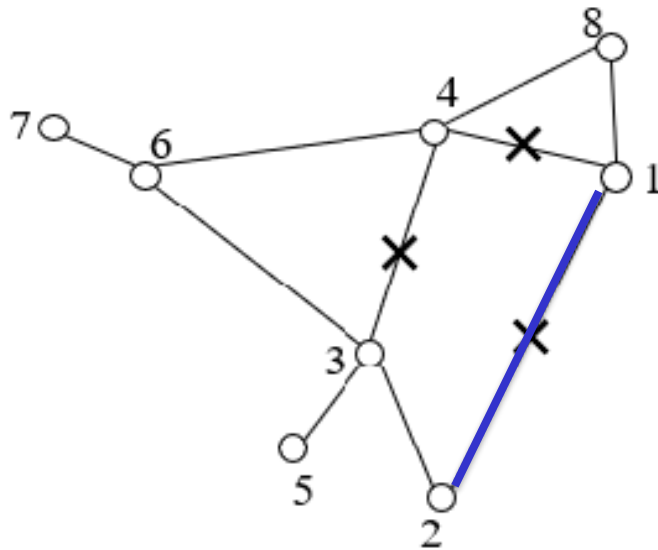
- Link Pruning (Wu and Jiang 2020)

- Link  $uv$  can be removed if there is a replacement path (under  $k$ -hop view,  $k=2$ ) connecting  $u$  and  $v$ : all intermediate links have higher priorities than  $uv$ .



# Neighbor Set Reduction

- Asynchronous link pruning
- Still 2-hop views from two end nodes
- Replacement paths (avoiding circular replacements)



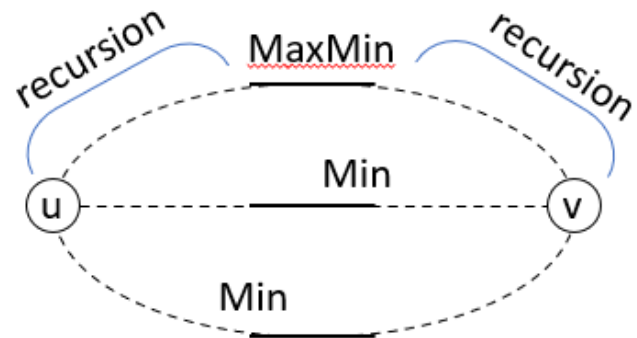
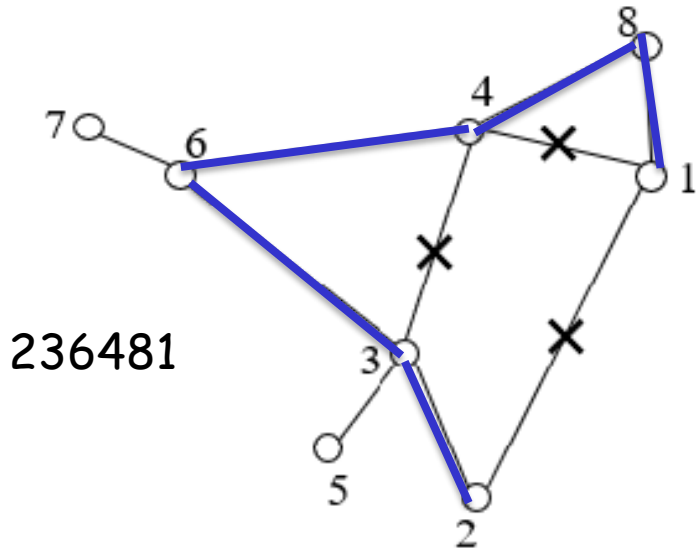
Replace for 12:

2341  
23481  
23641  
236481

# Irreplaceable Replacement Path

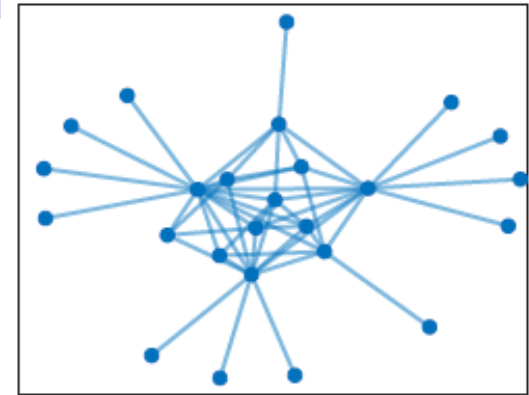
- Irreplaceable replacement path
  - **Min** link: of a replacement path
  - **MaxMin** link: max of min links of all replacement paths

**Theorem:** Given a connected graph, the resultant graph after link pruning will remain connected.

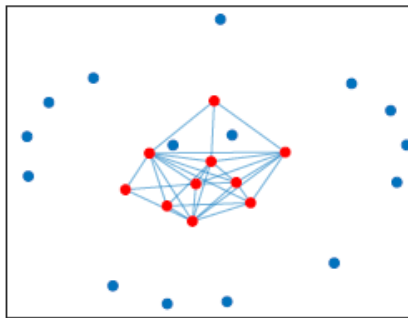


# A 25-node example

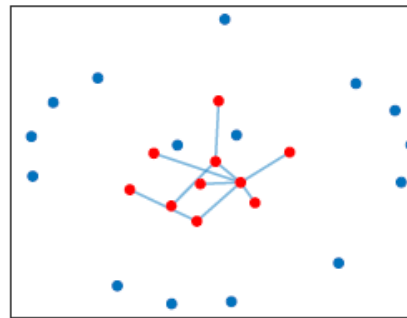
- Pooling or pruning only
- A combination of pooling and pruning



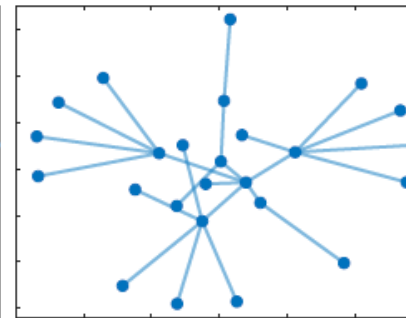
(a) The original LN topology.



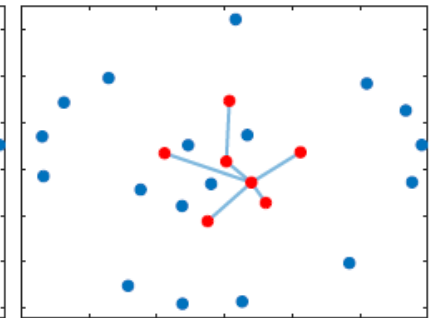
(b) Pooling only.



(c) Pooling then pruning.



(d) Pruning only.



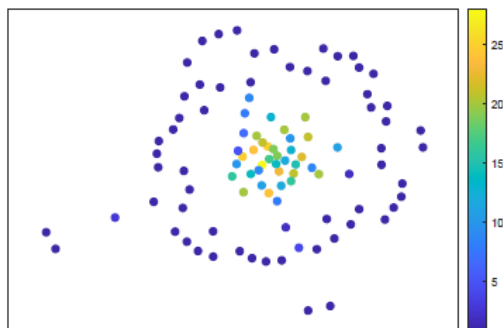
(e) Pruning then pooling.

# 5. Performance Evaluation

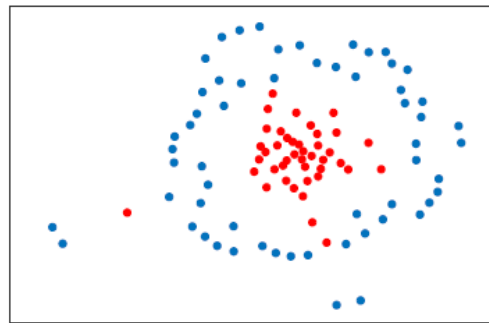
- Channel capacity
  - Three intervals
- Channel balance
  - Perfectly balanced
  - Randomly balanced
- Transaction amount
  - Homogeneous
  - Heterogeneous  
(micro, small, med., large)
- Node/link reduction
  - Pooling/pruning efficiency
- Success ratio (SR)
  - Single transaction (ST)
  - Transaction flow (TF)
- Path length (PL)
  - Routing fees (not include)
- Node degree (ND)

# Topologies

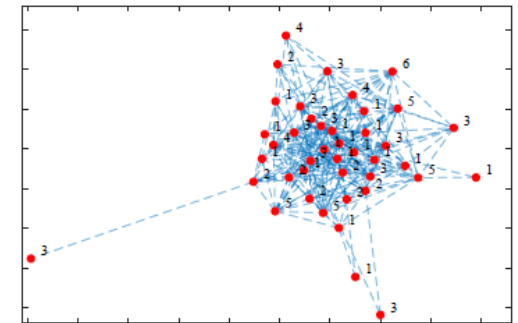
- Custom network (CN)
  - Power law distribution for LNs
  - 100 nodes and 340 links
  - Reduction to 42 supernodes
- ISP and Watts-Strogatz (WS)
  - ISP: power law and WS: small world



(a) The custom network.



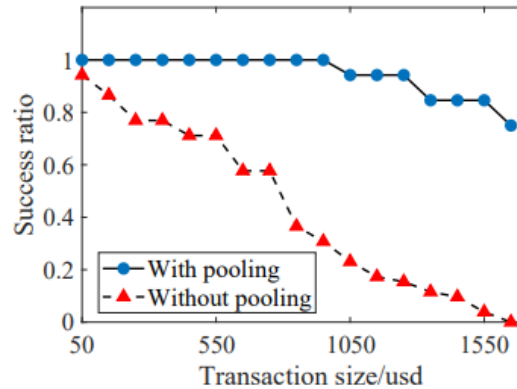
(b) Pooling: supernodes marked red.



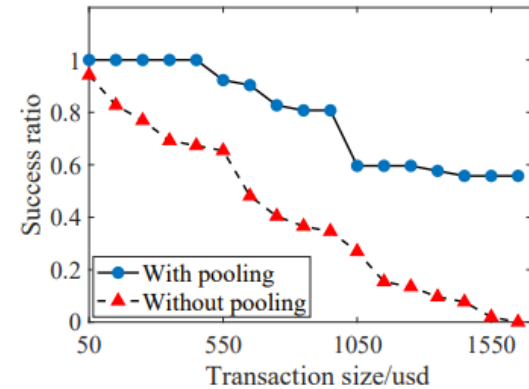
(c) Supernodes: numbers for pool sizes.

# Pooling only on CN: homogenous

Randomly balanced

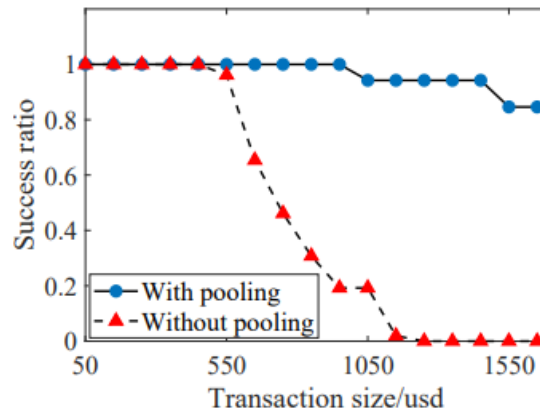


(a) Single transaction success ratio.

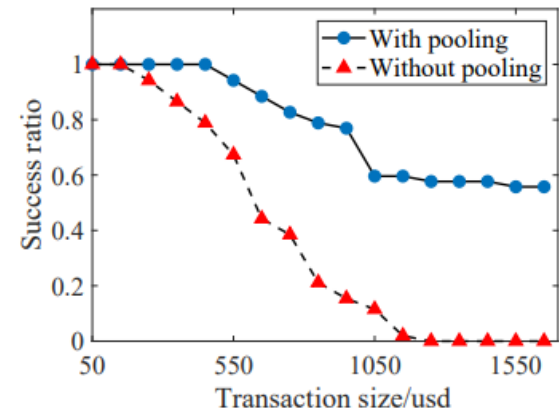


(b) Transaction flow success ratio.

Perfectly balanced



(a) Single transaction success ratio.

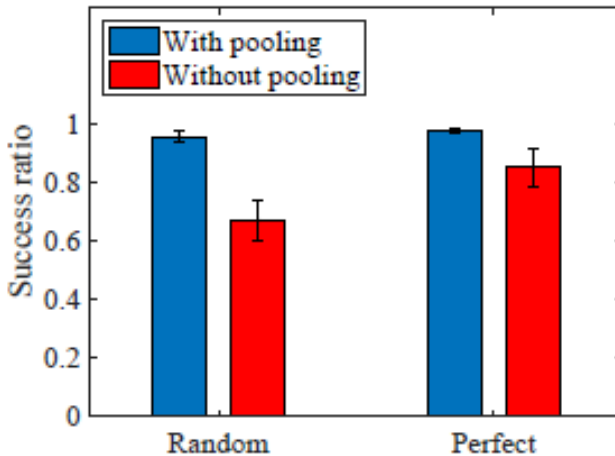


(b) Transaction flow success ratio.

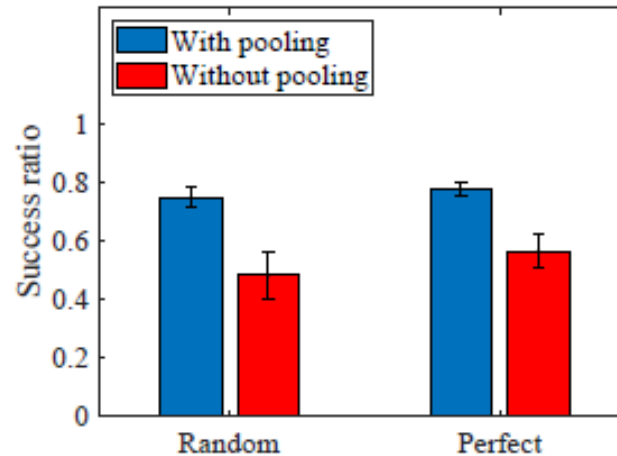
Channel capacity: [1000, 1500) 50%, [1500, 2000) 35%, [2000, 2500) 15%



# Pooling only on CN: heterogenous



(a) Single transaction success ratio.



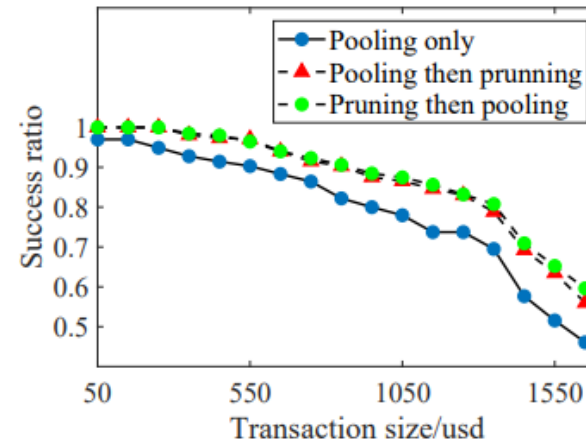
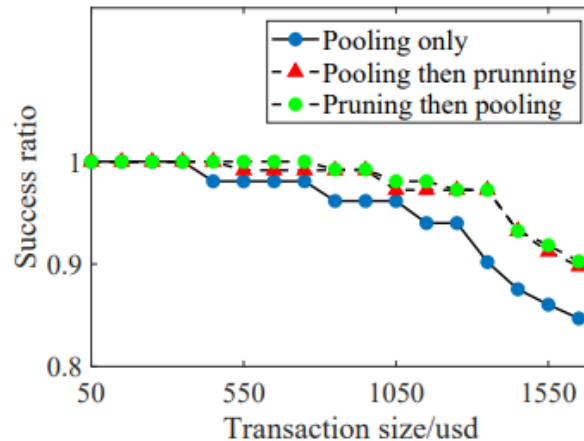
(b) Transaction flow success ratio.

Improvement is more significant in transaction flow

Transactions: micro (0, 200] 40%, small (200, 800] 30%  
med. (800, 1000] 20%, large (1000, 1600] 10%

# Pooling + Pruning on CN

Homogenous



Heterogenous

$( V ,  E )$	Operation	STSR	TFSR	PL	ND
(100, 340)	W/O pooling	0.45	0.48	4.89	6.80
(42, 255)	W/ pooling	0.75	0.77	6.35	12.14
(42, 213)	Pooling, pruning	0.88	0.83	7.01	10.14
(43, 226)	Pruning, pooling	0.87	0.86	7.12	10.51

# ISP and WS

Effectiveness of pooling/pruning on success ratio (SR)

Tradeoff: SR vs. path length (PL)

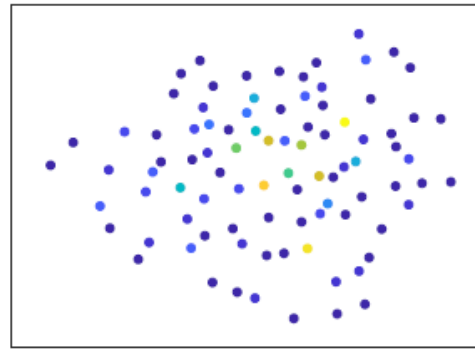
Topo( V ,  E )	Operation	STSR	TFSR	PL	ND
ISP(42, 66)	W/O pooling	0.64	0.68	2.8	3.14
ISP(12, 18)	W pooling	0.85	0.84	3.2	3
ISP(12, 15)	Pooling, pruning	0.94	0.95	3.8	2.5
ISP(10, 13)	Pruning, pooling	0.98	1	3.4	2.6
WS(100, 200)	W/O pooling	0.52	0.49	4.2	4
WS(81, 133)	W pooling	0.61	0.66	6.7	3.28
WS(81, 108)	Pooling, pruning	0.69	0.76	7.1	2.67
WS(82, 117)	Pruning, pooling	0.67	0.74	6.9	2.85

# Update Cost

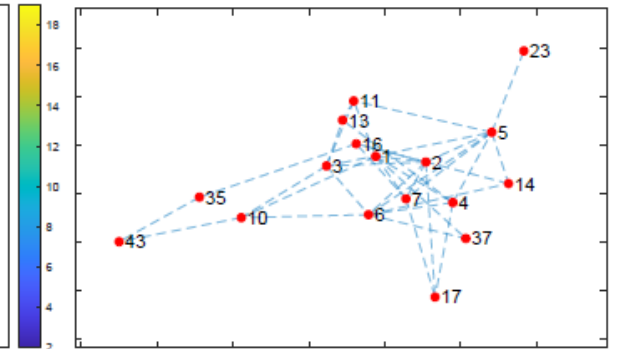
A sample CN:  
 $(V, E) = (90, 199)$   
 Diameter  $D=8$

Another CN:  
 $(V, E) = (70, 197)$   
 Diameter  $D=4$

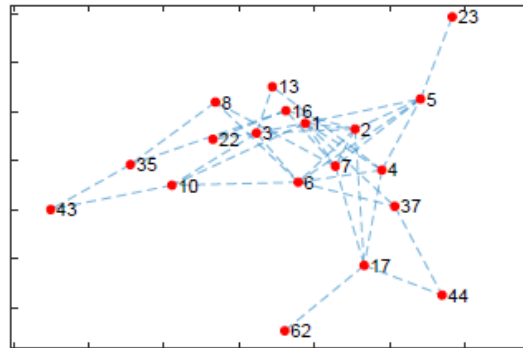
Global CDS:  
 Guha/Khuller's solution



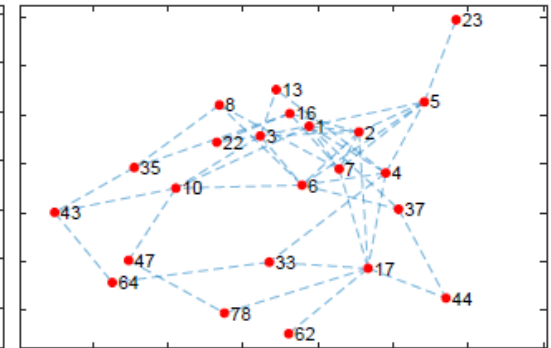
(a) The original LN topology.



(b) Size of global: 17.



(c) Size of supernodes w/ 3-hop: 19.



(d) Size of supernodes w/ 2-hop: 23.

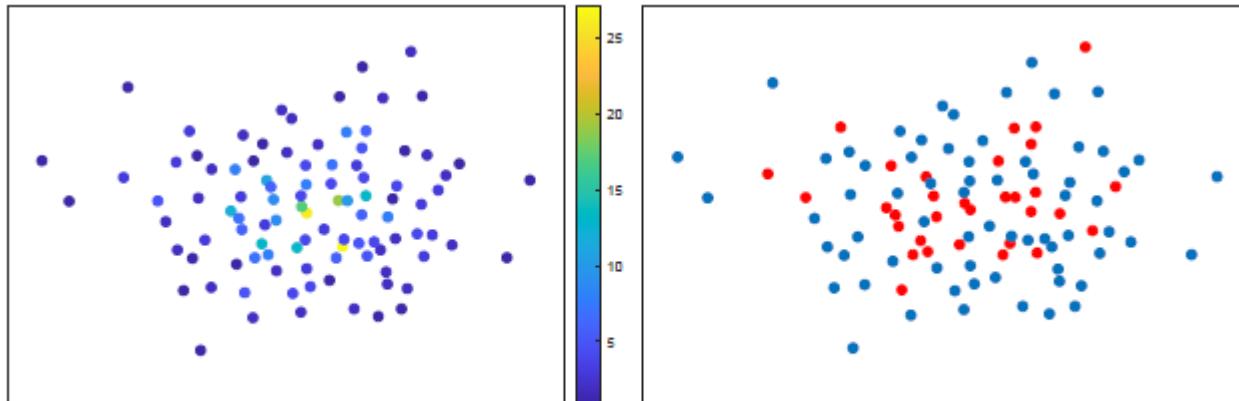
$D = 8 / 4$	Global	Local	
		3-hop	2-hop
# of supernode	17 / 15	19 / 17	23 / 17
rm-edge	23.4 / 22.7	1.82 / 1.47	1.78 / 1.44
rm-node	24.2 / 24	4.80 / 3.67	4.20 / 3.58
add-edge	23.6 / 22.2	1.96 / 1.33	1.90 / 1.29
add-node	23.9 / 22.6	1.11 / 1.06	1.10 / 1.05
add-node-with-edges	24.0 / 22.3	1.45 / 1.78	1.17 / 1.52

# CLoTH Testbed

CLoTH: A payment network testbed,  $(V, E) = (100, 224)$

Transaction #: 1,200 (heterogenous)

Transaction fees: 10 (per node)



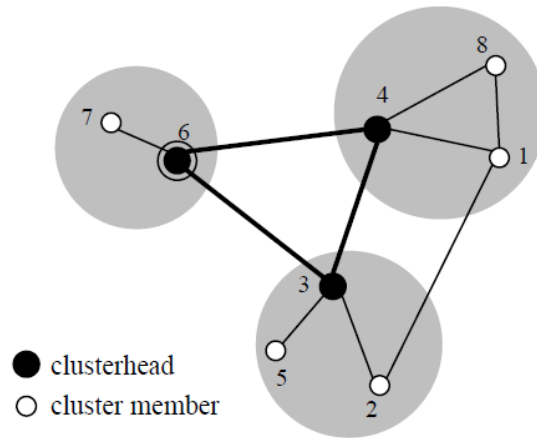
(a) Testbed network.

(b) Pooling: supernodes marked red.

TFSR	W/O pooling	W/ pooling	REVIVE	
			every 200 tx	every 400 tx
Random	0.718	0.967	0.932	0.921
Perfect	0.788	0.985	0.941	0.927

# 6. Future Work

- Hierarchical clustering
  - Supernodes of supernodes (e.g., node 6)



- Trade-offs
  - Benefit (successful transactions)
  - Cost (various fees/updates)

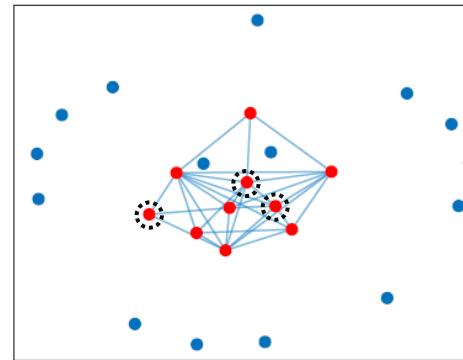
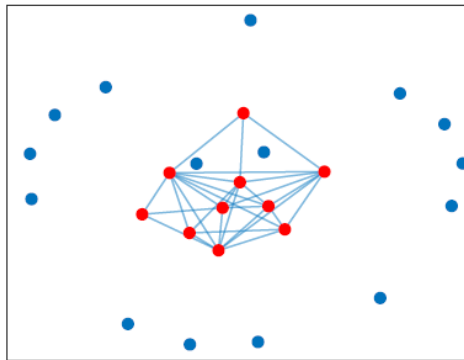
# Future Work (Cont'd)

- Impact of locality

- Value of  $k$  on pooling efficiency and local fixes

- ID rotation

- E.g., ID inversion (for size reduction)



- Others

- Games: on topology, fund allocation, and routing fees

# Future Trends

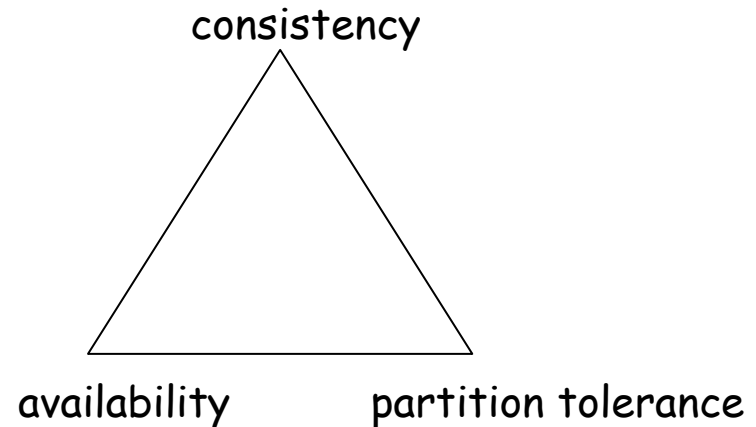
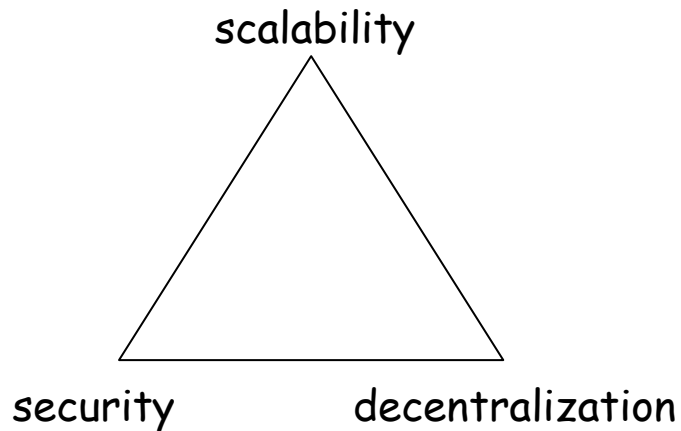
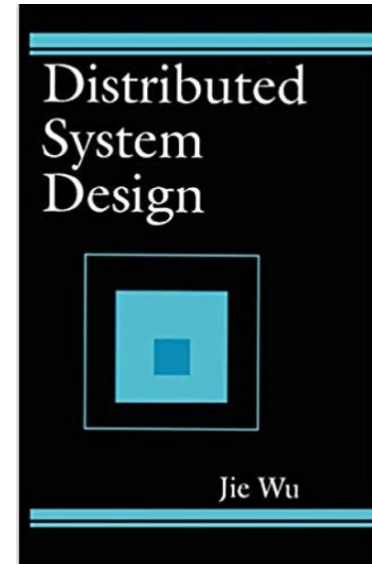
- Future of cryptocurrency
  - Decentralized: Bitcoin
  - Centralized: Digital Currency Electronic Payment (DCEP)
  - In-between: Libra (Novi wallet)
- Blockchain smartphones
  - Commercial: HTC and Samsung
  - Edge blockchain via offloading





# Blockchain vs. Distributed Sys. (DS)

- Past results applied in blockchain?
  - Latency hiding
  - Concurrency control
  - Quorum voting
- Trilemma in blockchain and DS



# Questions



J. Wu and F. Dai, "A Generic Distributed Broadcast Scheme in Ad Hoc Wireless Networks," *IEEE Transactions on Computers*, 2004.

J. Wu and S. Jiang, "Local Pooling of Connected Supernode in Lightning Networks for Blockchains," *Proc. of IEEE Blockchain*, 2020.