

# Privacy-Preserving Network Verification System Scalable for Internet Infrastructures

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**Check your connection**

You don't seem to have an active internet connection. Please check your connection and try again.

Close

Facebook | Error

https://www.facebook.com

**Sorry, something went wrong.**

We're working on it and we'll get it fixed as soon as we can.

[Go Back](#)

Facebook © 2018 · [Help Center](#)

# Network Outage


# 503

**Service Unavailable**

The server is temporarily busy, try again later!

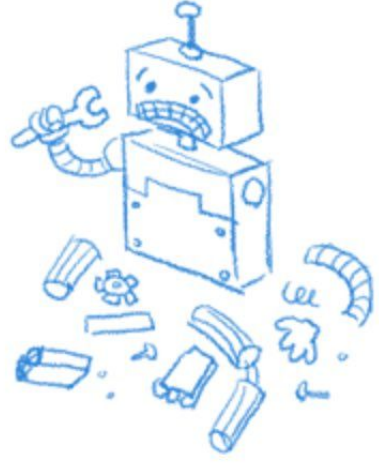
Error 500 (Server Error)!!1

https://myaccount.google.com



**500.** That's an error.

There was an error. Please try again later. That's all we know.



checking the network cables, modem, and router

connecting to Wi-Fi

Enabling Windows Network D

IE\_FINISHED\_NO\_INTERNET

There was a problem loading this website

Try refreshing the page.

If the site still doesn't load, please try again in a few minutes.

Refresh Page



# Network Outages

**\$9,000**

**every minute**

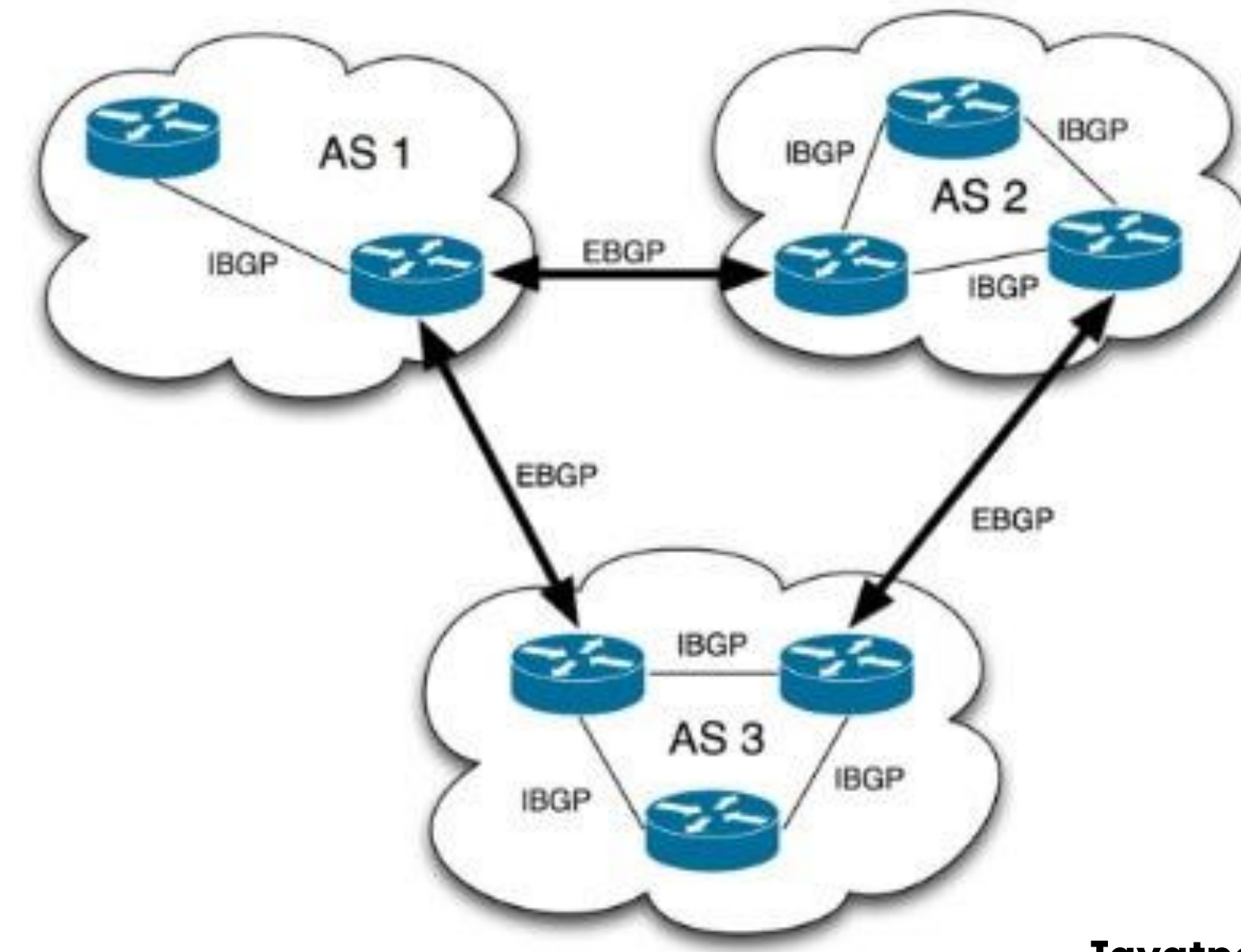
**\$100M**

**Meta's lost revenue from  
one outage in 2021**



# Internet Infrastructure

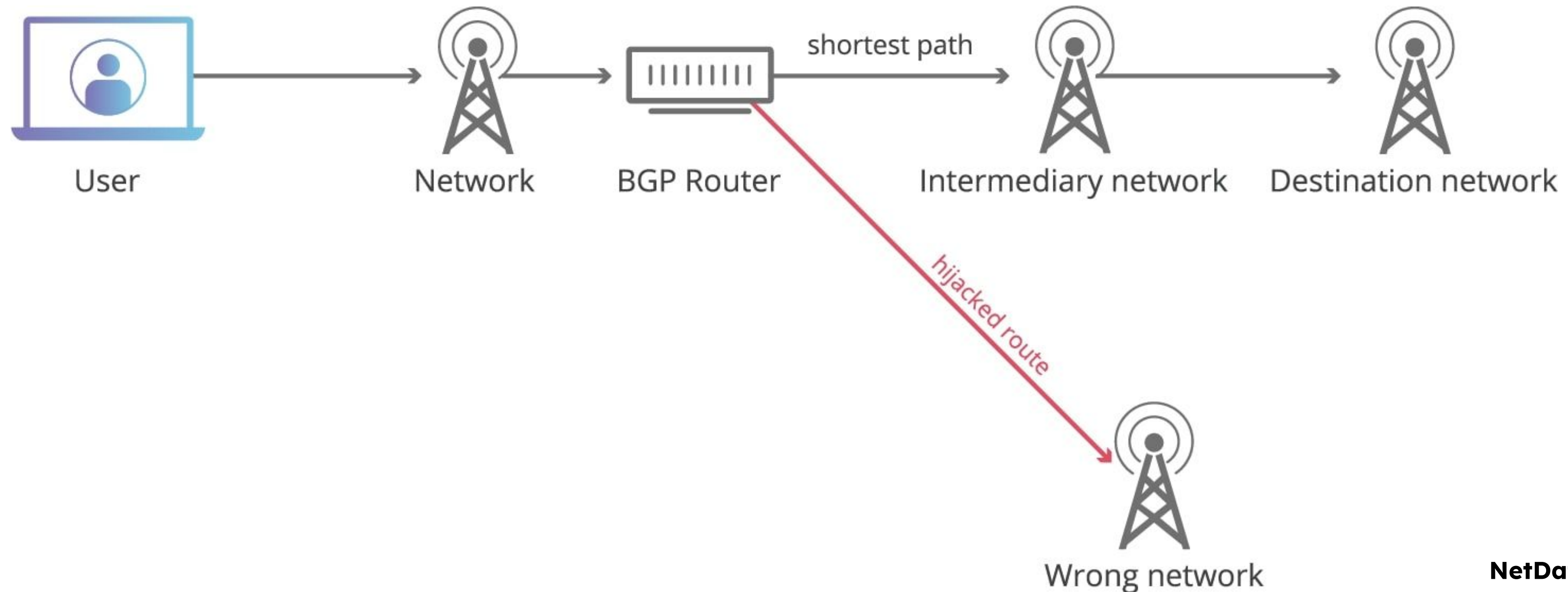
- Graph of **autonomous systems (AS)** connected to each other
  - Each AS contains **routers** which direct the flow of data
  - Communicate by sending data packets to each other



Javatpoint

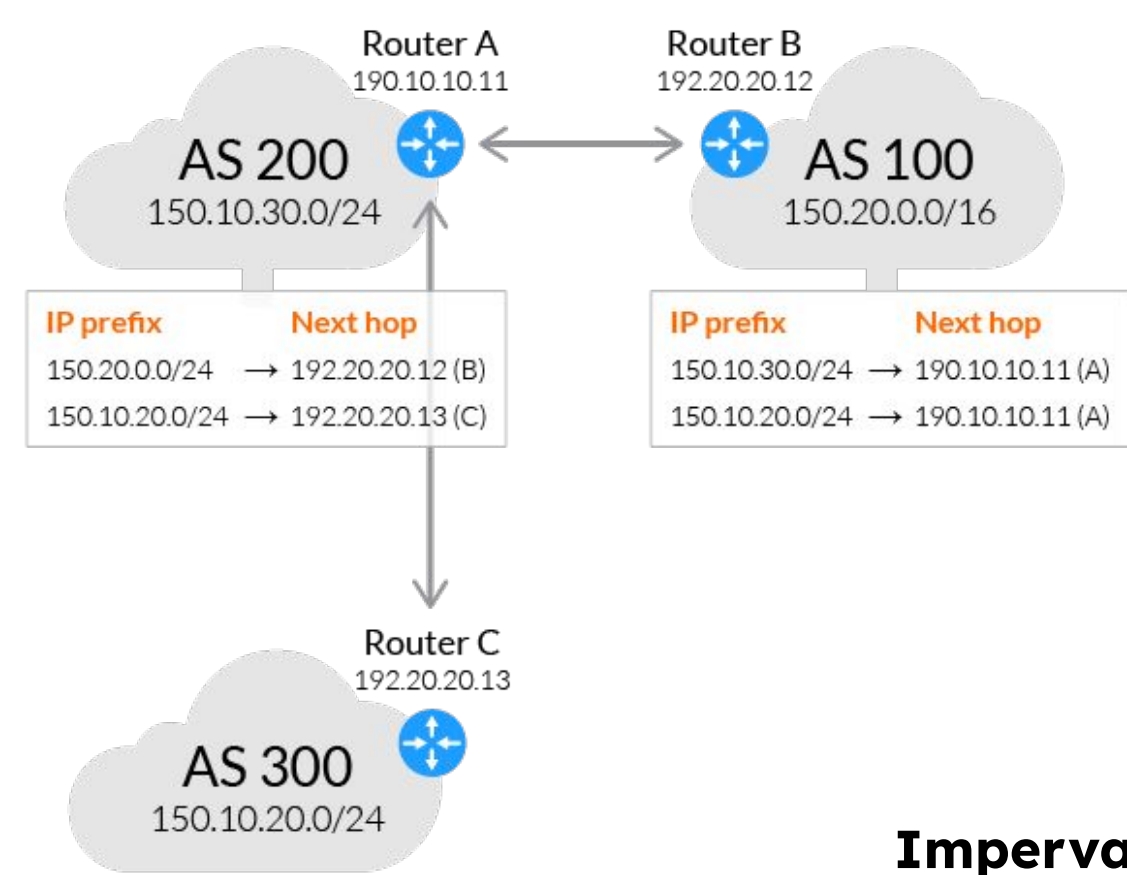
# BGP Misconfigurations

- Routers know how and where to transfer information through the **Border Gateway Protocol (BGP) peering** protocol
- AS administrators often need to make changes to BGP peering protocol
- Can lead to **BGP misconfigurations**

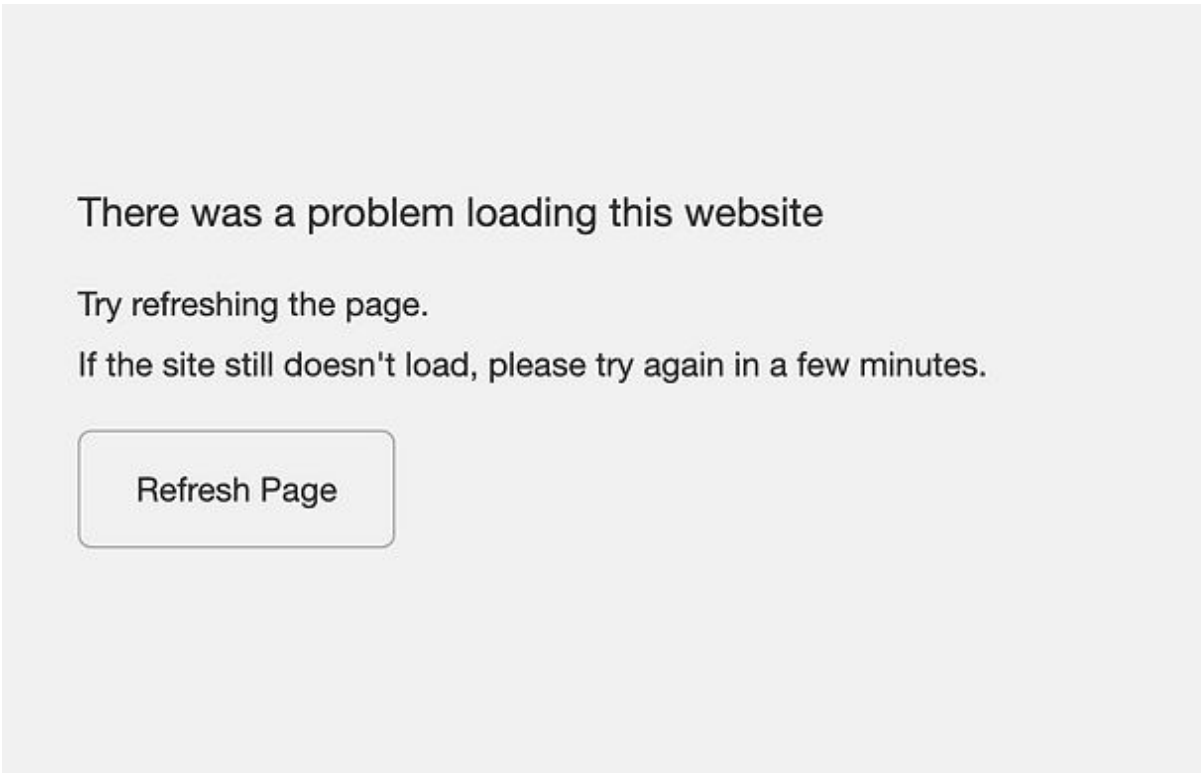


NetData

# Network Outages



**Border Gateway Protocol (BGP) Misconfiguration**  
Error in the BGP configuration



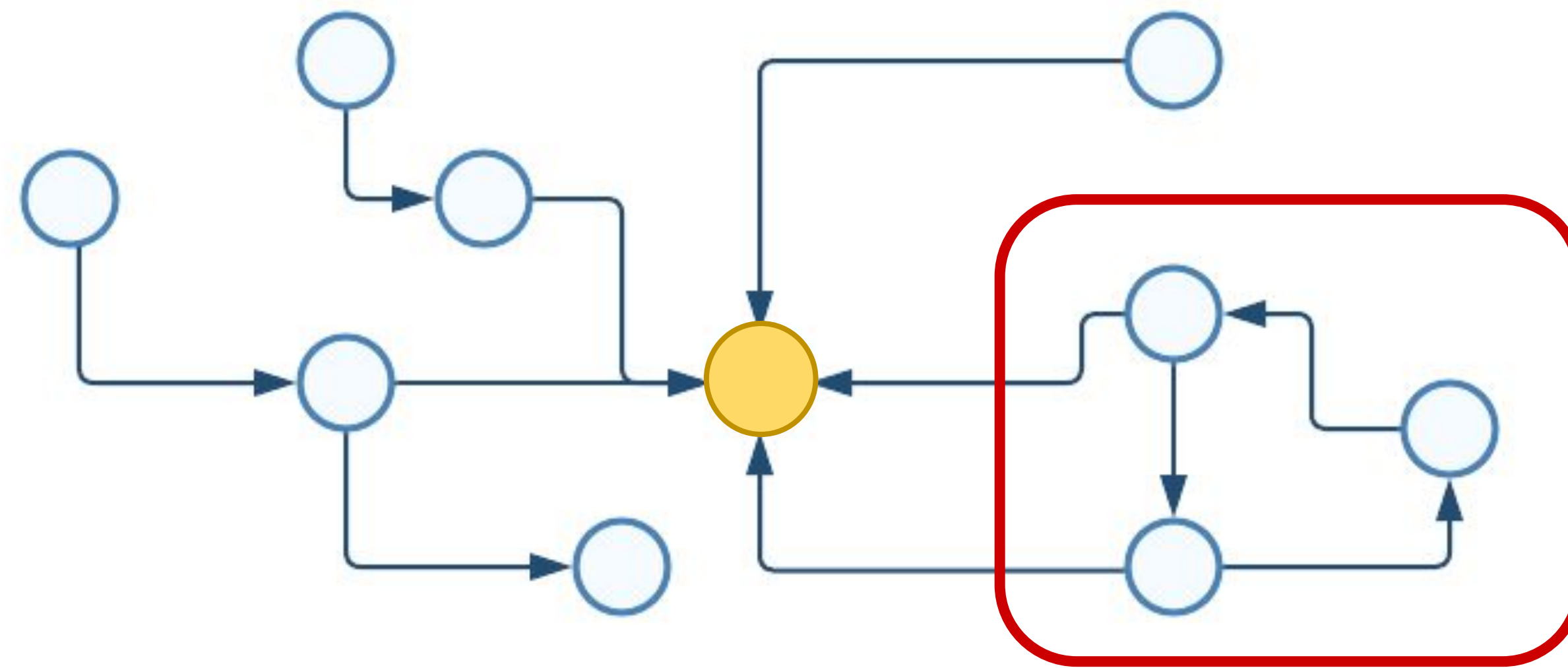
**Network Outage**  
Unexpected downtime and outage of the autonomous system.



**Network Verification**  
Create a network verification process that checks that the BGP protocol is running correctly, and new protocols are enacted correctly.

# Internet Graph Information

- We operate on **forwarding information base (FIB) table graph** with nodes and edges
  - Each node only points to one other node
  - All nodes should eventually lead to one **destination node**
  - Network should not contain loops

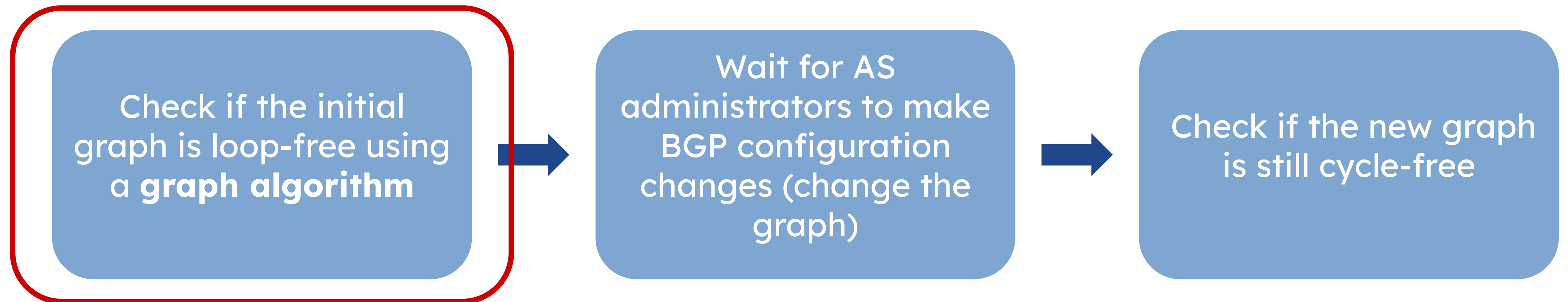


**loop in network**



# Network Verification System Goals

- Create a network verification system that is
  - **efficient:** able to handle real-time processing and live updates
  - **privacy-preserving:** BGP policies and configurations are often private data due to security and commercial reasons
  - **scalable:** Internet networks are large and require scalability



**Which graph algorithm  
do we use?**



# Find Most Efficient Graph Algorithm

- Implement graph algorithms modified to detect cycles
- Benchmark and compare graph algorithm speeds on different graphs
  - Testing for efficiency and scalability
  - Run each algorithm five times and take the average

| Graph Algorithm      | Execution Time |
|----------------------|----------------|
| Breadth-First Search | ?              |
| Depth-First Search   | ?              |
| Tarjan's Algorithm   | ?              |
| Topological Sort     | ?              |
| Johnson's Algorithm  | ?              |
| Disjoint-Set Union   | ?              |

# Dataset Pre-Processing

- Pre-process data (CAIDA) and use to create graphs to test algorithms on
- Types of graphs:
  - AS-link graphs (regular graphs) with few nodes and edges to test scalability
  - **forwarding information base (FIB) table graph** as the desired type of graph

direct AS link between from\_AS and to\_AS

```
# .....  
# D from_AS to_AS monitor_key1 monitor_key2 ...  
# D 1909 1227 0 3  
#  
# This line describes a direct AS link between from_AS and to_AS.  
# A direct AS link exists if two adjacent IP hops in a traceroute  
# path map to two distinct ASes.  
#  
# For example:  
#  
# IP path: ... 10.0.0.1 10.0.0.2 192.168.0.1 192.168.0.2 ...  
# AS path: ... A A B B ...  
#           \ /  
#           There is a direct AS link from A to B.  
#
```

Dataset from Center for Applied Internet  
Data Analysis (CAIDA): IPv4 Routed /24  
AS Links Dataset



# Graph Algorithm Benchmarking

|                  | Nodes | Edges | BFS    | DFS    | Topology | Tarjan's | DSU    | Johnson |
|------------------|-------|-------|--------|--------|----------|----------|--------|---------|
| <b>AS Link 1</b> | 280   | 1384  | 0.0019 | 0.0011 | 0.0015   | 0.0015   | 0.0572 | 0.8426  |
| <b>AS Link 2</b> | 1421  | 5500  | 0.0063 | 0.0054 | 0.0067   | 0.0071   | 0.0459 | 0.7315  |
| <b>FIB 1</b>     | 25061 | 25066 | 0.0197 | 0.0409 | 0.0686   | 0.0666   | 0.0744 | 22.2109 |
| <b>FIB 2</b>     | 25061 | 25089 | 0.0255 | 0.0542 | 0.0637   | 0.0718   | 0.0806 | 21.8804 |
| <b>FIB 3</b>     | 25061 | 25071 | 0.0232 | 0.0486 | 0.0588   | 0.0686   | 0.1108 | 22.4681 |
| <b>FIB 4</b>     | 25061 | 25067 | 0.0234 | 0.0426 | 0.0619   | 0.0732   | 0.0887 | 22.7568 |
| <b>FIB 5</b>     | 25061 | 25079 | 0.0238 | 0.0519 | 0.0664   | 0.0729   | 0.0850 | 22.0689 |

# Graph Algorithm Benchmarking

|                  | Nodes | Edges | BFS    | DFS    |
|------------------|-------|-------|--------|--------|
| <b>AS Link 1</b> | 280   | 1384  | 0.0019 | 0.0011 |
| <b>AS Link 2</b> | 1421  | 5500  | 0.0063 | 0.0054 |
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- Depth-first search is faster in the AS-link graph but breadth-first search is faster on FIB graphs
- FIB graphs are actually used in network verification system
- We choose **breadth-first search** for our network verification system

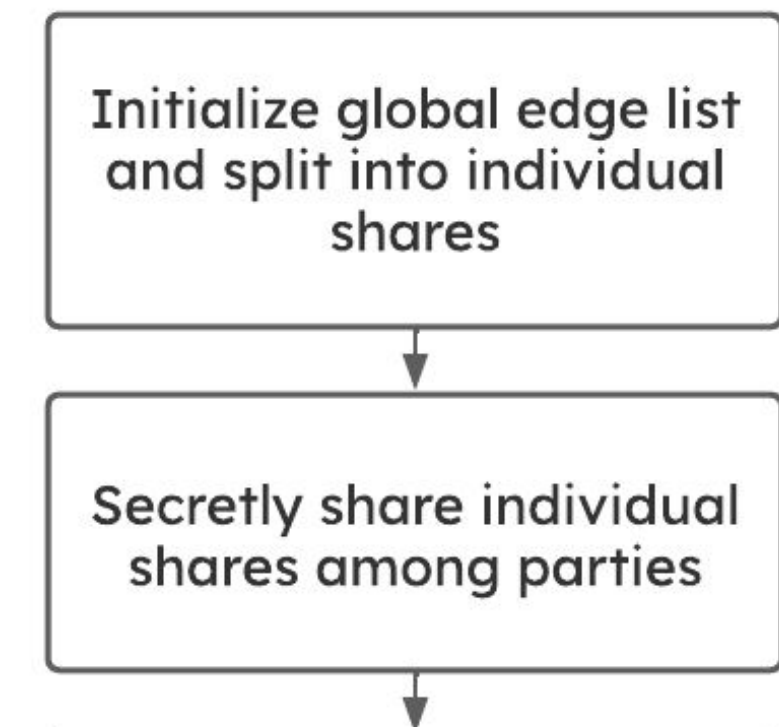
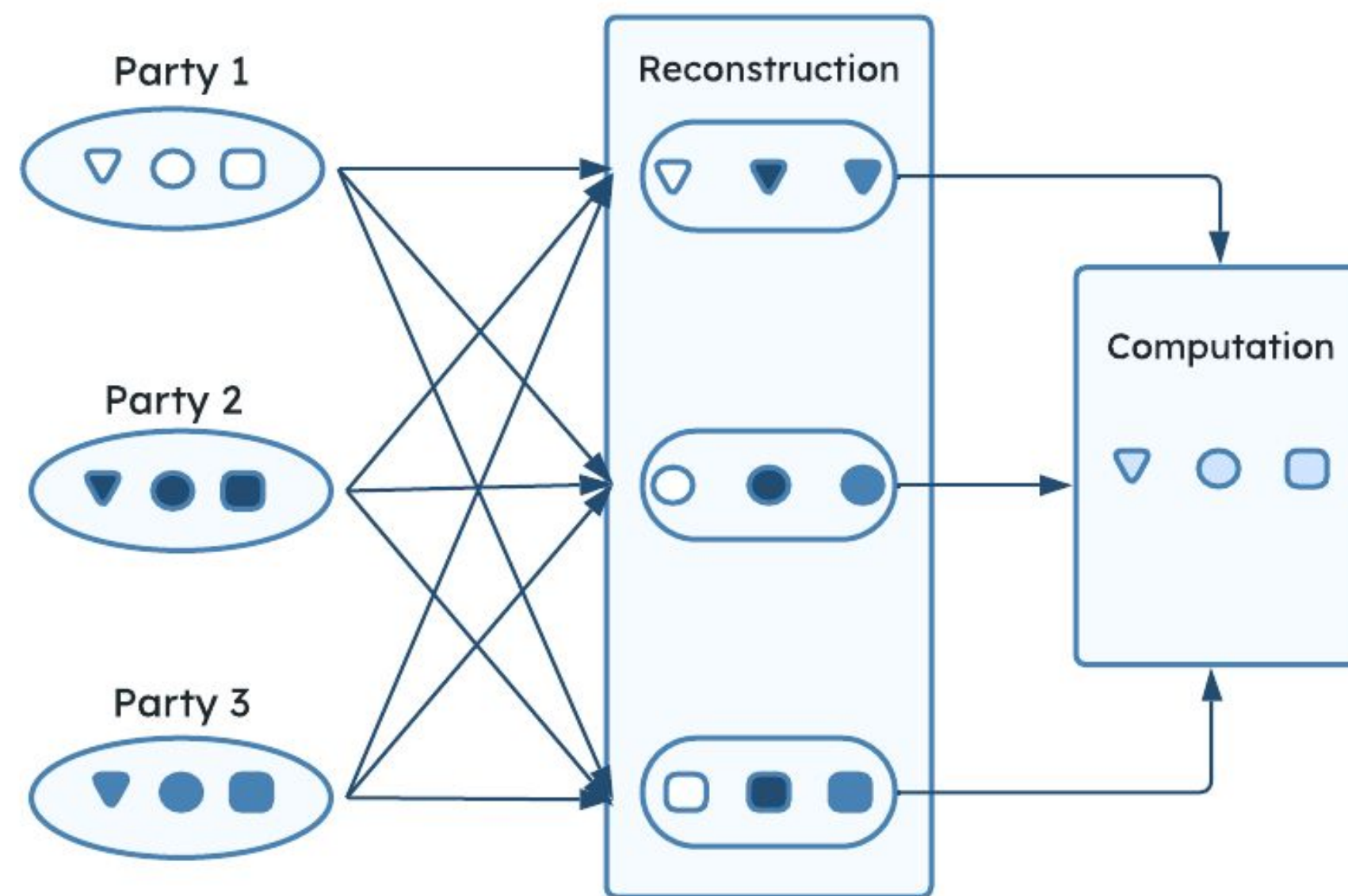
Fastest two algorithms



# Proposed Network Verification System

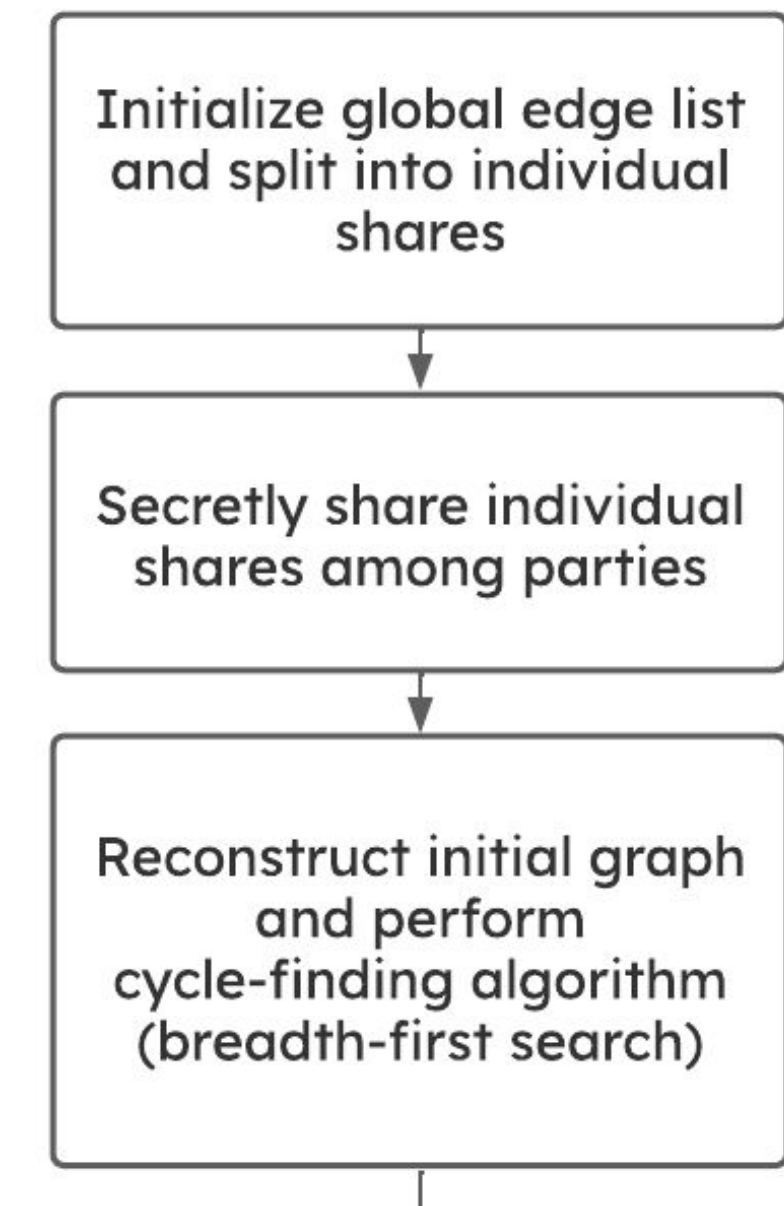
Combine graph algorithm with **multi-party computation**

- Implemented through the SCALE-MAMBA framework
- Allow multiple parties with private inputs to compute together without revealing all graph to one party



# Proposed Network Verification System

Use loop detection algorithm (**breadth-first search**) to determine if the original graph has errors

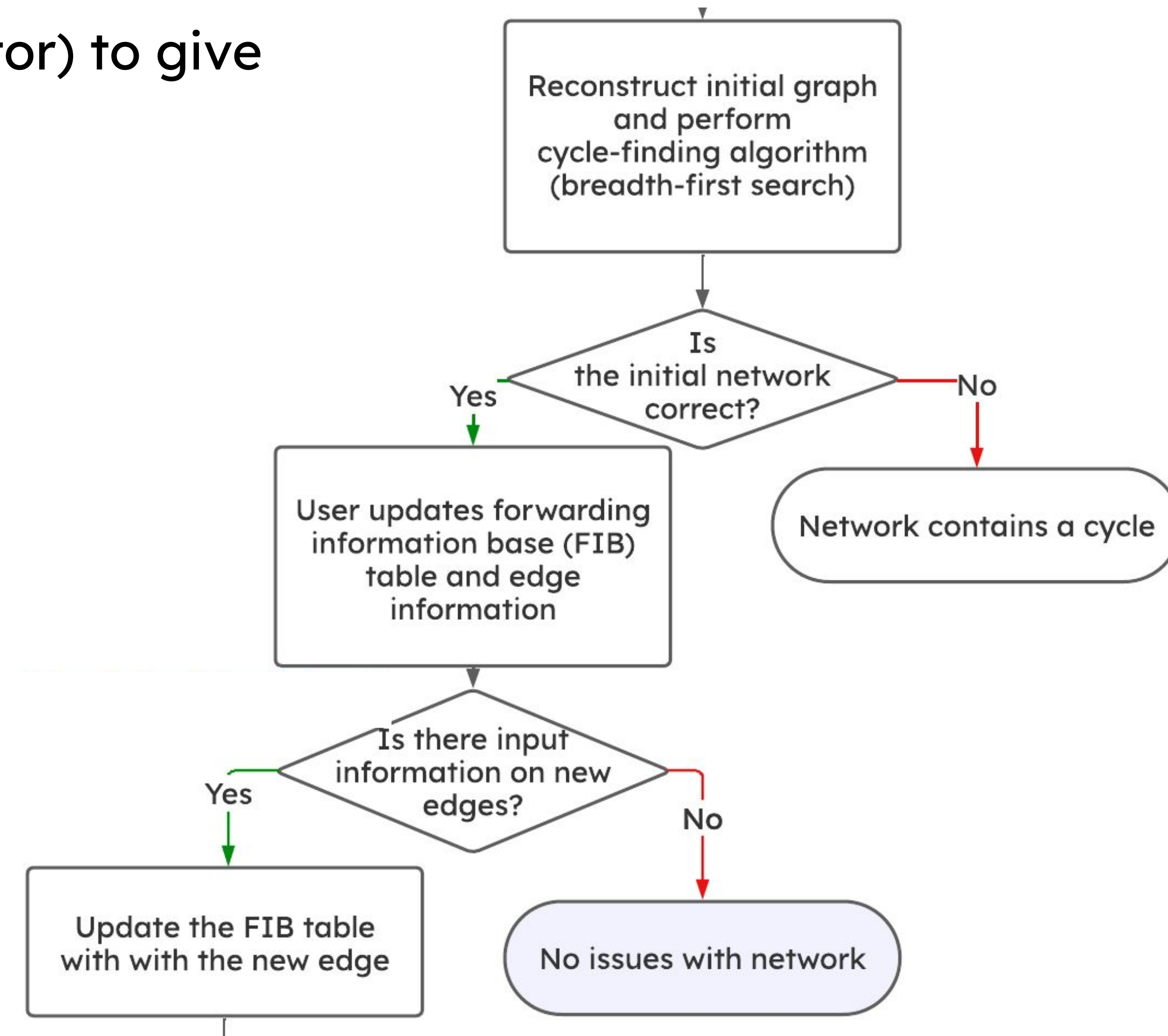




# Proposed Network Verification System

If there are no errors, wait for the user (AS administrator) to give potential new information regarding FIB edge:

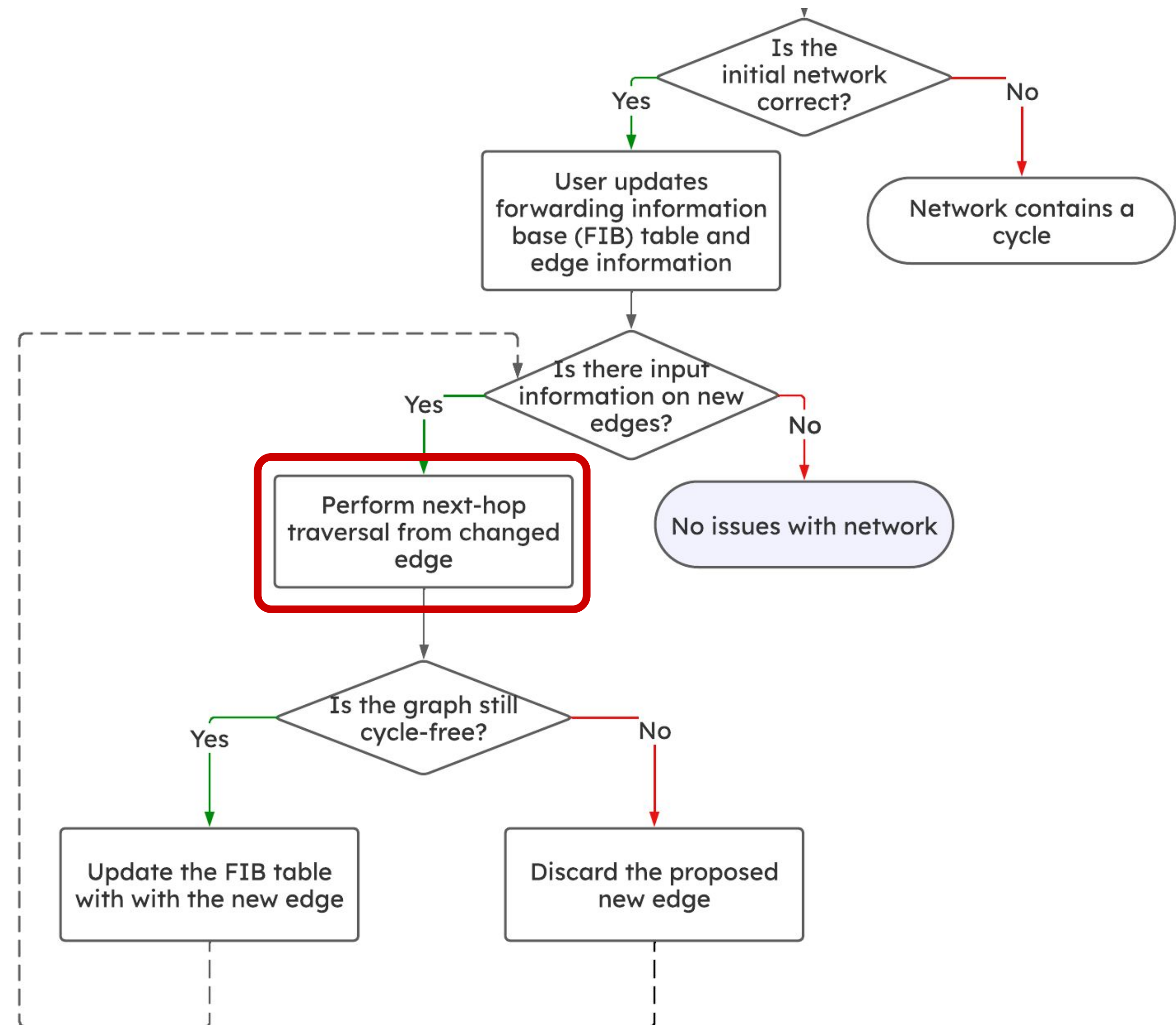
- In the format  $(a, b)$  where AS  $a$  now points to AS  $b$
- Changes in the graph can create potential cycles



# Proposed Network Verification System

Perform next-hop traversal from new edge

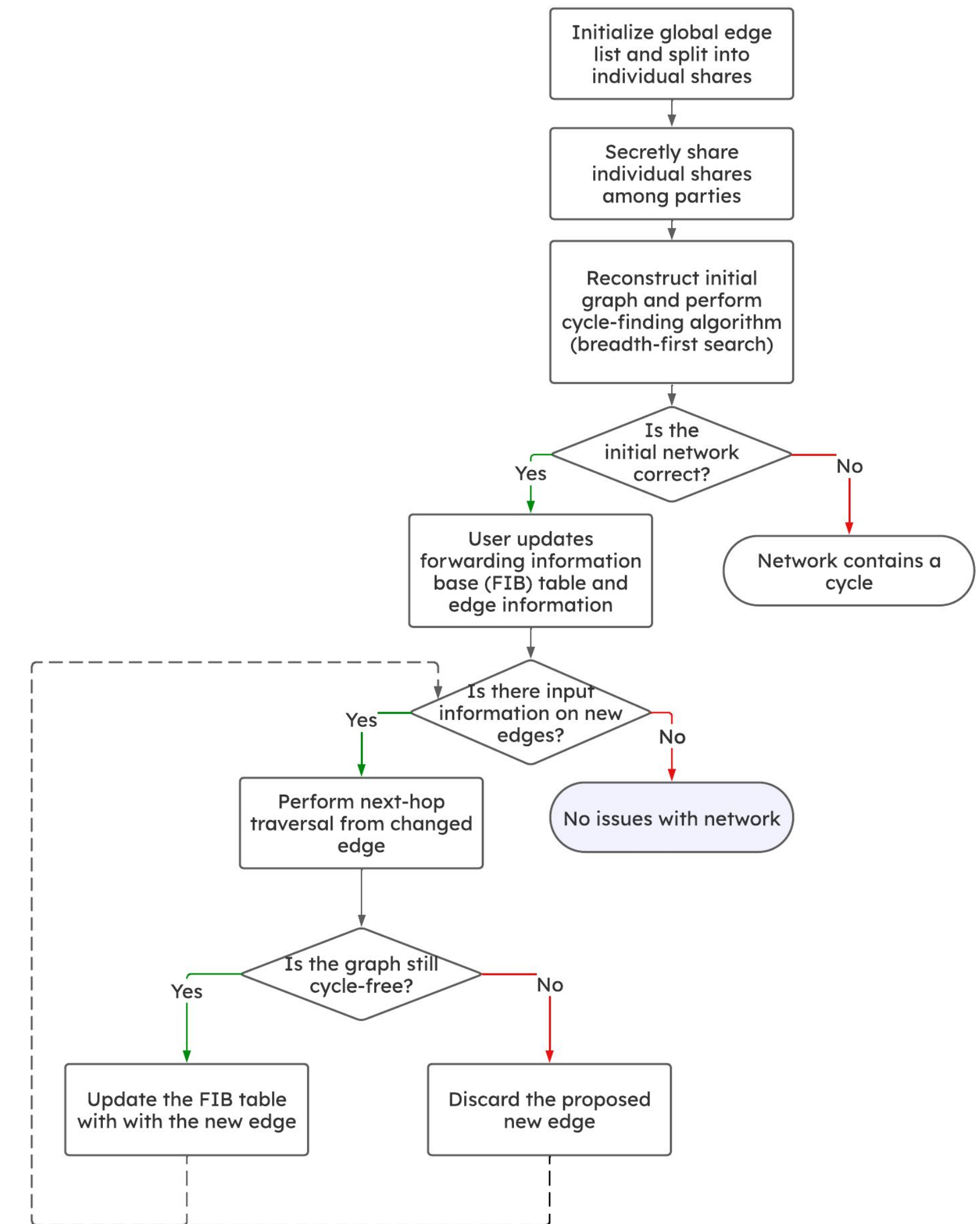
- Edge changes only affect nodes directly connected to the edge
- Only reconstruct the edges of nodes directly connected to the changed protocol
- Taken from the individual shares from separate parties and re-aggregate
- Follow the next-hop values until
  1. Reach a node we already visited
  2. Reach 15 hops
  3. Reach destination node





# Conclusion

- As Internet infrastructures grow in scale and complexity, network verification is more important
- We create a network verification system that is efficient, privacy-preserving, and scalable
  - Utilizing **breadth-first search** as our initial cycle-finding algorithm
  - Checking for cycles after an AS administrator changes an edge
- Future direction: find more privacy-preserving techniques i.e. using different multi-party computation framework





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# References

- [1] Rekhter, Y., Li, T., & Hares, S. (2006). A Border Gateway Protocol 4 (BGP-4). RFC 4271.
- [2] Griffin, T. G., & Wilfong, G. T. (1999). An Analysis of BGP Convergence Properties. IEEE/ACM Transactions on Networking, 7(6), 841-853. doi:10.1109/90.811436
- [3] Morris, "Facebook's outage cost the company nearly \$100 million in revenue," Fortune, October 4, 2021. [Online]. Available: <https://fortune.com/2021/10/04/facebook-outage-cost-revenue-instagram-whatsapp-not-working-stock/>.
- [4] Ponemon Institute. (2016). Cost of Data Center Outages. [Online]. Available: [https://www.vertiv.com/globalassets/documents/reports/2016-cost-of-data-center-outages-11-11\\_51190\\_1.pdf](https://www.vertiv.com/globalassets/documents/reports/2016-cost-of-data-center-outages-11-11_51190_1.pdf). Accessed: July 15 2023.
- [5] M. Blanton, A. Steele, and M. Alisagari, "Data-oblivious graph algorithms for secure computation and outsourcing," in Proceedings of the 8th ACM SIGSAC symposium on Information, computer and communications security (ASIA CCS '13), May 2013, pp. 207-218.
- [6] Y. Lindell and B. Pinkas, "Secure Multiparty Computation for Privacy-Preserving Data Mining," Journal of Privacy and Confidentiality, vol. 1, no. 1, pp. 59-98, 2009.
- [7] Moreno-Sanchez, Pedro & Kate, Aniket & Maffei, Matteo & Pecina, Kim. (2015). Privacy Preserving Payments in Credit Networks. 10.14722/ndss.2015.23284.
- [8] The IPv4 Routed /24 AS Links Dataset - <June 24, 2023 - August 5, 2023>, [https://www.caida.org/catalog/datasets/ipv4\\_routed\\_topology\\_aslinks\\_dataset/](https://www.caida.org/catalog/datasets/ipv4_routed_topology_aslinks_dataset/)
- [9] D. B. Johnson, "Efficient algorithms for shortest paths in sparse networks," Journal of the ACM, vol. 24, no. 1, pp. 1-13, 1977
- [10] Robert W. Floyd. 1962. Algorithm 97: Shortest path. Commun. ACM 5, 6 (1962), 345. <https://dl.acm.org/doi/10.1145/367766.368168>
- [11] R. E. Tarjan, "Depth-first search and linear graph algorithms," SIAM Journal on Computing, vol. 1, no. 2, pp. 146-160, 1972. doi: 10.1137/0201010
- [12] Aly, A., Cong, K., Keller, M., Orsini, E., Rotaru, D., Scherer, O., Scholl, P., Smart, N.P., Tanguy, T., Wood, T.: SCALE and MAMBA v1.14: Documentation (2021) <https://homes.esat.kuleuven.be/~nsmart/SCALE/>.
- [13] SCALE-MAMBA v1.14 : Documentation, <https://homes.esat.kuleuven.be/~nsmart/SCALE/Documentation.pdf>.