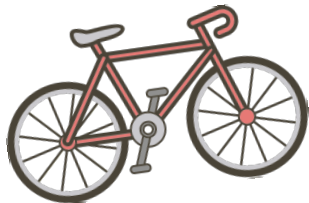


Verifying maximum link loads in a changing world

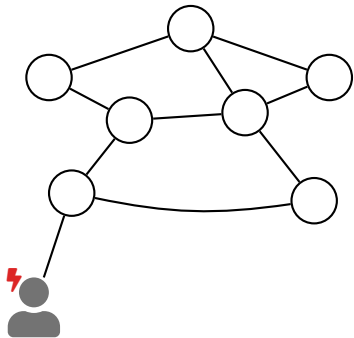
*Tibor Schneider*¹, Stefano Vissicchio², Laurent Vanbever¹

NSDI, April 30, 2025

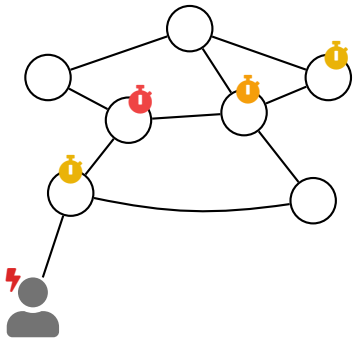


¹ **ETH** zürich

²  UCL

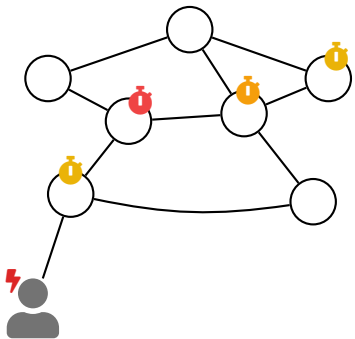


Link loads are a key indicator for network performance.



Monitor the live network.

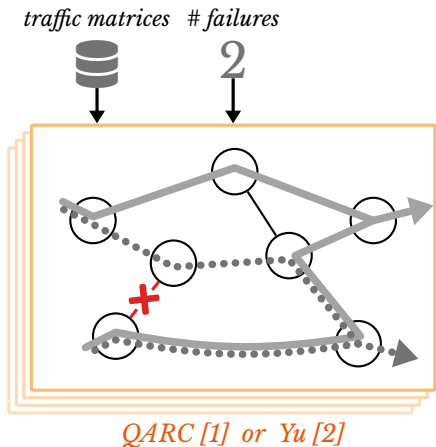
Link loads are a key indicator for network performance.



Monitor the live network.

⚡ Can it happen again *in the future*?

Recent systems find worst-case link loads under failures.

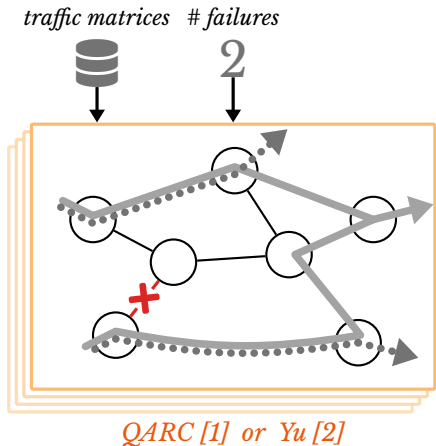


Find *worst-case* loads under arbitrary failures.

[1] Kausik Subramanian et al. "Detecting network load violations for distributed control planes". In: *ACM SIGPLAN*. 2020

[2] Ruihan Li et al. "A General and Efficient Approach to Verifying Traffic Load Properties under Arbitrary k Failures". In: *ACM SIGCOMM*. 2024

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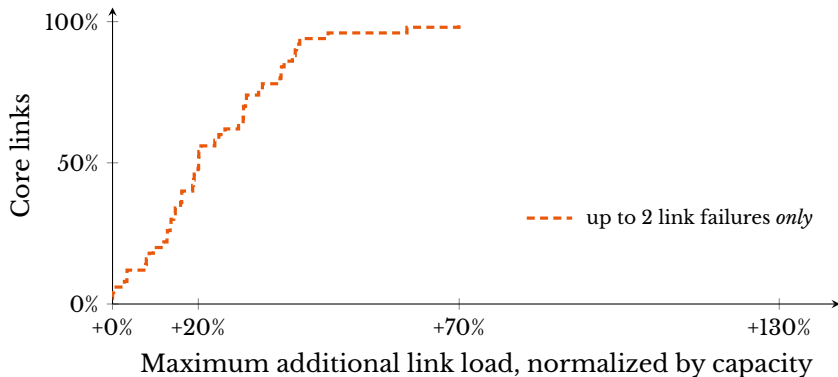


Find *worst-case* loads under arbitrary failures.
⚡ Traffic also depends on *BGP routing inputs*.

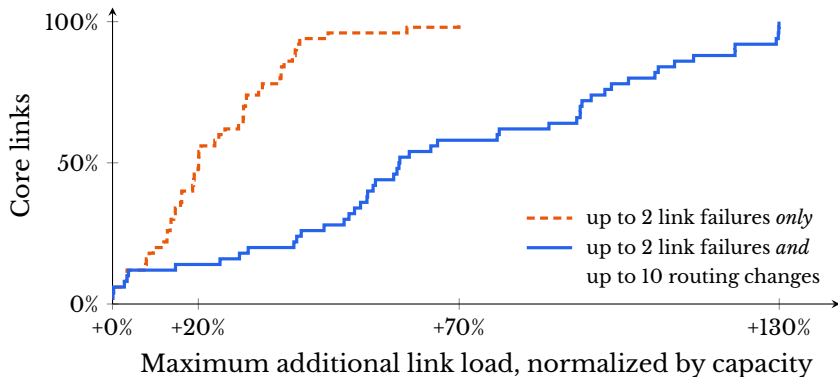
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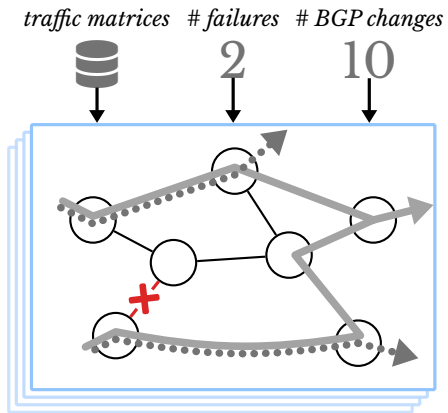
Ignoring routing changes leads to underestimating worst-case loads.



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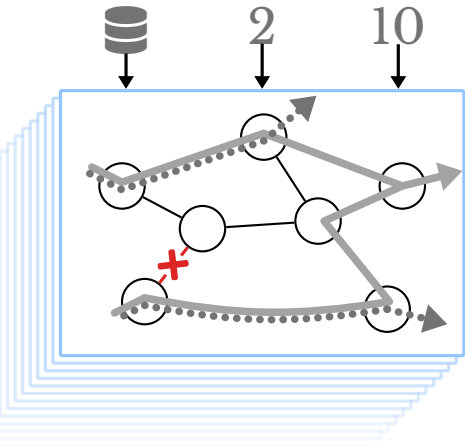


The space of failures *and* route changes is huge and difficult to navigate.



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traffic matrices # failures # BGP changes



- A destination can be advertised by *any subset* of BGP neighbors.

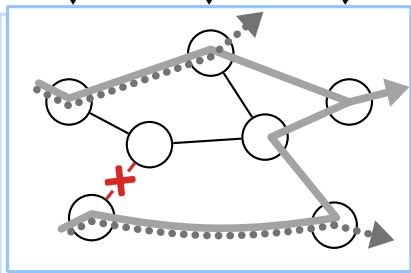
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traffic matrices # failures # BGP changes



2

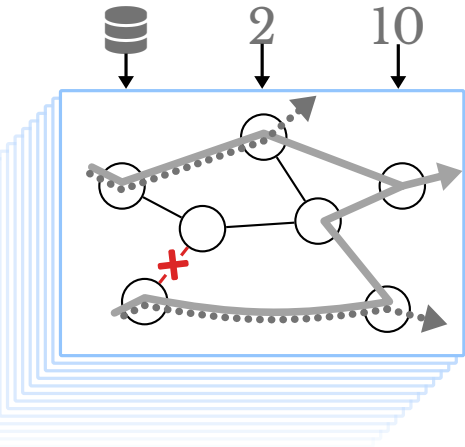
10



- A destination can be advertised by *any subset* of BGP neighbors.
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traffic matrices # failures # BGP changes



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- Over *one million* of destination prefixes.

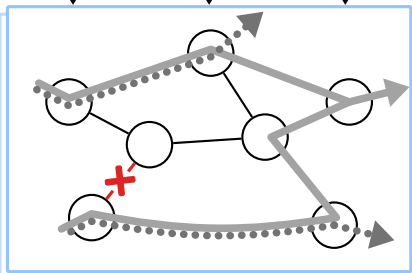
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traffic matrices # failures # BGP changes



2

10



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Velo: Verify maximum link loads under failures and routing changes



Search space reduction:

A single egress router maximizes link loads.

Input size reduction:

Cluster destination with similar traffic patterns.



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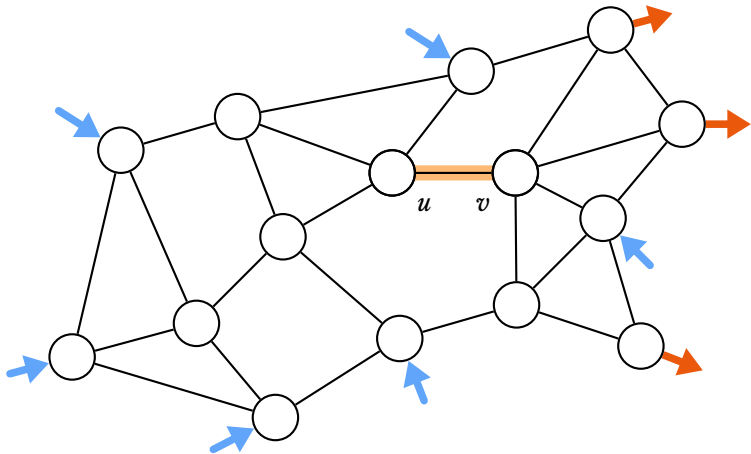
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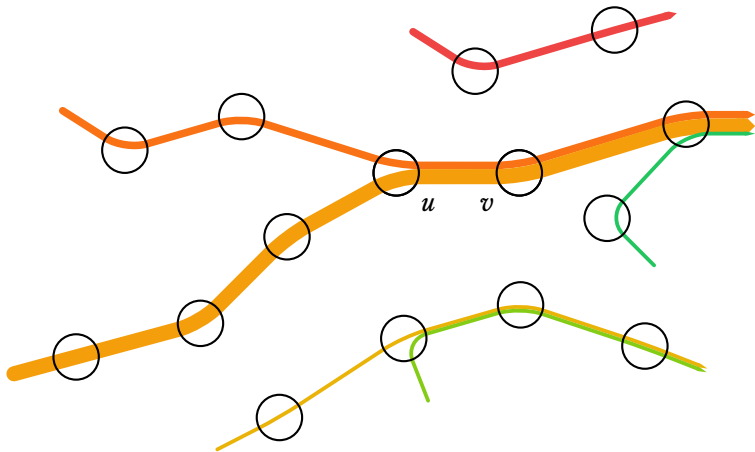


Idea: Consider each failure separately.

- In a given failure scenario, worst-case states for destinations are *independently*.

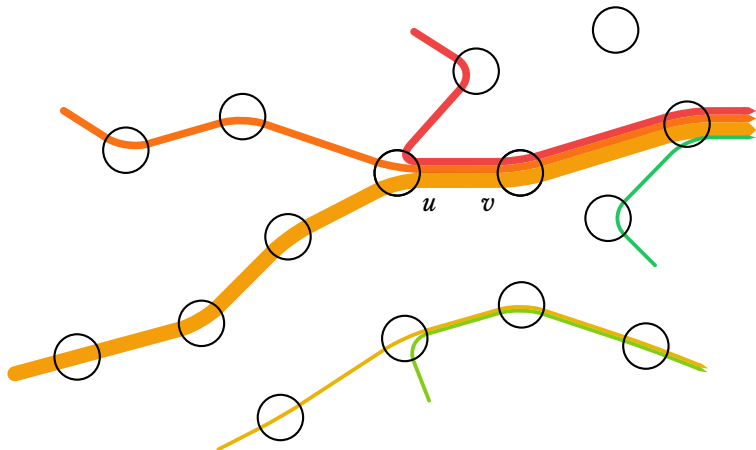


Nodes forwarding traffic via $u-v$ choose the same route as v .

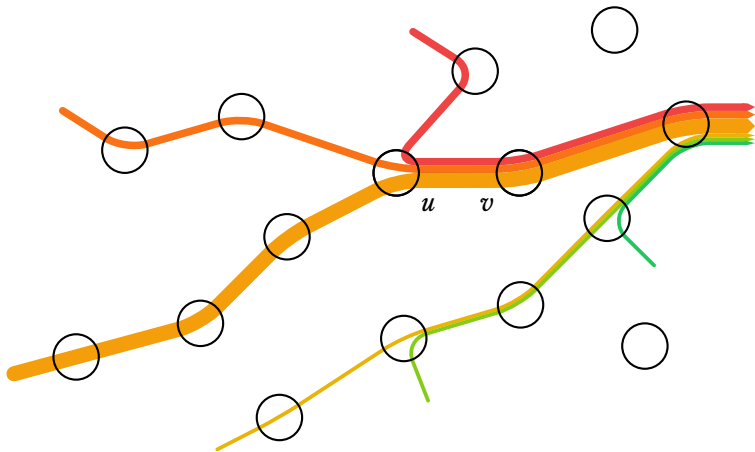


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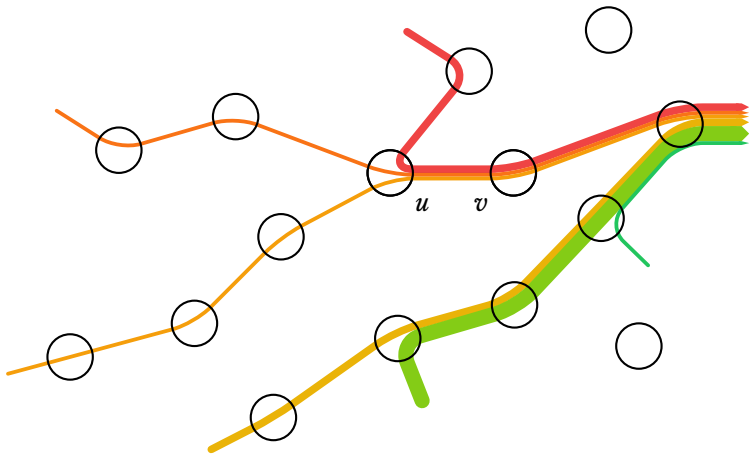
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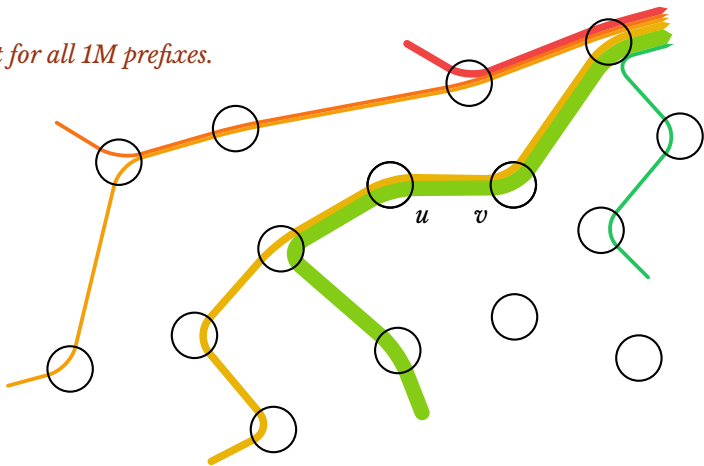


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⚡ Repeat for all $1M$ prefixes.



Velo: Verify maximum link loads under failures and routing changes



Search space reduction:

A single egress router maximizes link loads.

Input size reduction:

Cluster destination with similar traffic patterns.



We can “combine” traffic for destinations with *similar distributions*.


$$\mathbf{M} = \begin{bmatrix} 0.89 & 0.08 & 7.43 & 0.66 & 0.09 & 0.04 & 2.49 & 0.03 & 3.15 & 2.45 & 3.74 & \dots \\ 3.45 & 0.41 & 0.46 & 1.60 & 4.80 & 0.25 & 0.89 & 5.52 & 0.63 & 4.71 & 3.47 & \dots \\ 7.06 & 0.72 & 4.79 & 0.58 & 0.31 & 8.81 & 0.32 & 0.16 & 0.57 & 0.37 & 2.78 & \dots \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \ddots \end{bmatrix}$$

destination prefixes

ingress points

We can “combine” traffic for destinations with *similar distributions*.

$$\mathbf{M} = \begin{bmatrix} \begin{array}{c|c} d_1 & d_2 \\ \hline 0.89 & 0.08 \\ 3.45 & 0.41 \\ 7.06 & 0.72 \\ \vdots & \vdots \end{array} & 7.43 & 0.66 & 0.09 & 0.04 & 2.49 & 0.03 & 3.15 & 2.45 & 3.74 & \dots \\ \hline & 0.46 & 1.60 & 4.80 & 0.25 & 0.89 & 5.52 & 0.63 & 4.71 & 3.47 & \dots \\ & 4.79 & 0.58 & 0.31 & 8.81 & 0.32 & 0.16 & 0.57 & 0.37 & 2.78 & \dots \\ & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \ddots \end{bmatrix}$$


10×

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 \begin{array}{c|c}
 d_1 & d_2 \\
 \hline
 0.89 & 0.08 \\
 3.45 & 0.41 \\
 7.06 & 0.72 \\
 \vdots & \vdots \\
 \vdots & \vdots
 \end{array}
 &
 \begin{array}{cccccccccccc}
 7.43 & 0.66 & 0.09 & 0.04 & 2.49 & 0.03 & 3.15 & 2.45 & 3.74 & \dots \\
 0.46 & 1.60 & 4.80 & 0.25 & 0.89 & 5.52 & 0.63 & 4.71 & 3.47 & \dots \\
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 \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \ddots
 \end{array}
 \end{bmatrix}$$

$$\mathbf{A} = \begin{bmatrix}
 0.97 & 7.43 & 0.66 & 0.09 & 0.04 & 2.49 & 0.03 & 3.15 & 2.45 & 3.74 & \dots \\
 3.86 & 0.46 & 1.60 & 4.80 & 0.25 & 0.89 & 5.52 & 0.63 & 4.71 & 3.47 & \dots \\
 7.78 & 4.79 & 0.58 & 0.31 & 8.81 & 0.32 & 0.16 & 0.57 & 0.37 & 2.78 & \dots \\
 \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \ddots
 \end{bmatrix}$$

Velo approximates the traffic matrix by clustering destinations.

$$\mathbf{M} = \begin{bmatrix} 0.89 & 0.08 & 7.43 & 0.66 & 0.09 & 0.04 & 2.49 & 0.03 & 3.15 & 2.45 & 3.74 & \dots \\ 3.45 & 0.41 & 0.46 & 1.60 & 4.80 & 0.25 & 0.89 & 5.52 & 0.63 & 4.71 & 3.47 & \dots \\ 7.06 & 0.72 & 4.79 & 0.58 & 0.31 & 8.81 & 0.32 & 0.16 & 0.57 & 0.37 & 2.78 & \dots \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \ddots \end{bmatrix}$$

modified K-means clustering

$$\mathbf{A} = \begin{bmatrix} 26.6 & 5.2 & 2.6 & \dots \\ 6.2 & 38.8 & 7.4 & \dots \\ 6.6 & 7.0 & 10.4 & \dots \\ \vdots & \vdots & \vdots & \ddots \end{bmatrix}$$

Velo: Verify maximum link loads under failures and routing changes



Search space reduction:

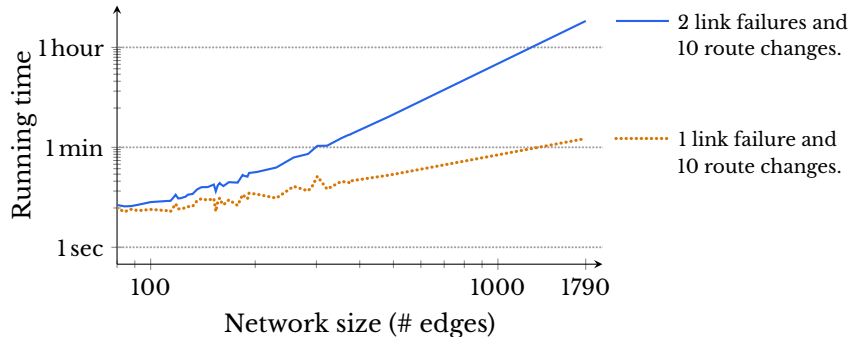
A single egress router maximizes link loads.

Input size reduction:

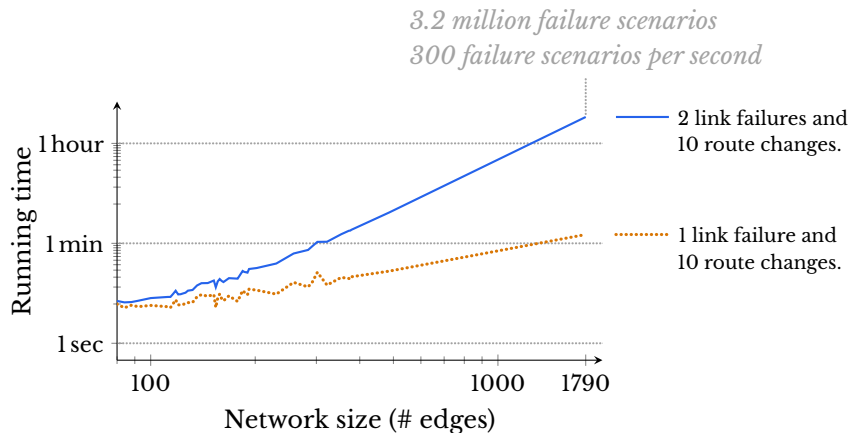
Cluster destination with similar traffic patterns.



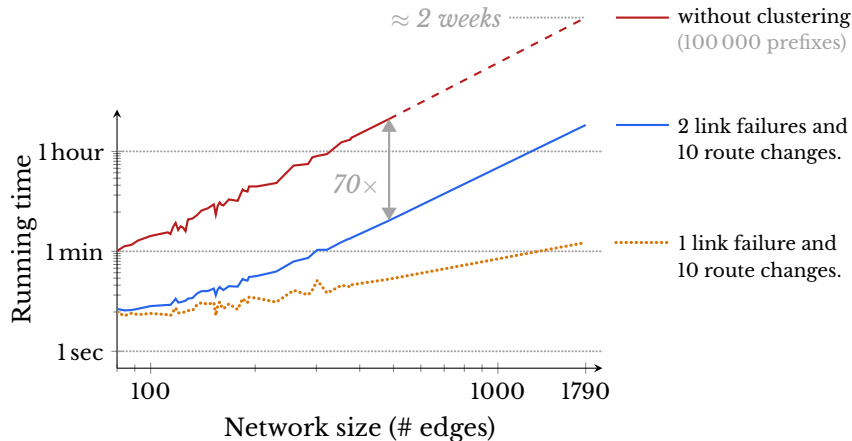
Velo finds the worst-case loads in *3 hours* for all 1790 links in an ISP.



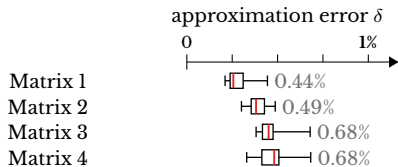
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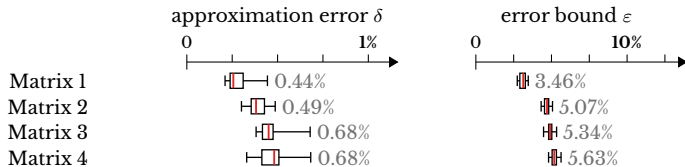
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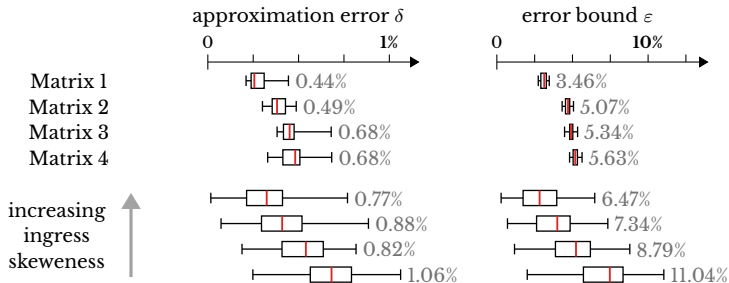
Velo achieves high accuracy with just 300 clusters.



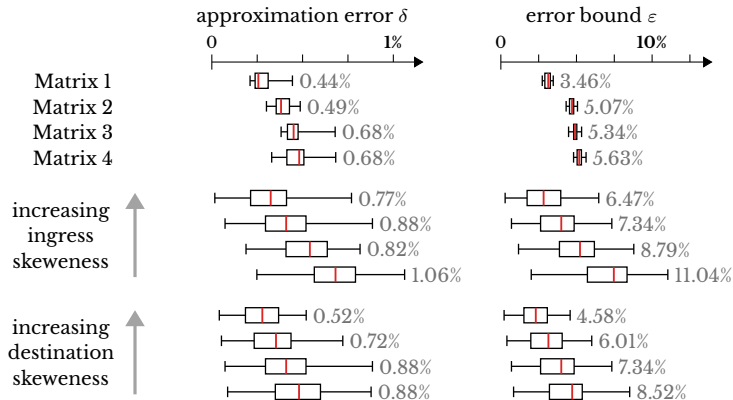
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Open problems and next steps.

Some destinations have more stable routes than others.

⇒ Can we use probabilistic techniques as well?

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Some destinations have more stable routes than others.

⇒ Can we use probabilistic techniques as well?

Ingress traffic is not constant.

⇒ Can we reason about traffic shifts as well?

Velo: Verifying maximum link loads in a changing world



Given a network, its configuration, and a traffic matrix, Velo finds the worst-case load of all links under routing changes and failures.



Search space reduction:

A single egress router maximizes link loads.



Input size reduction:

Cluster destination with similar traffic patterns.