

# Low-cost Enhancement of the Intra-domain Internet Robustness Against Intelligent Node Attacks

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# Modeling Internet node attacks

- Internet malicious activities are mostly manifested through node attacks
- “Intelligent” attacks usually consider the highest-degree nodes (hubs) as favorable targets
  - Akamai : more than 60% of 497 attacks orchestrated in the State of California involved subsets of vulnerable (hub-node) servers
- Typical countermeasure against node attacks: enhance connectivity adding redundancy (in the form of extra links)
- Simple heuristics have been mostly introduced to drive link-additions
  - Connect minimum/maximum Degree Centrality (DC) nodes
  - Connect minimum/maximum Betweenness Centrality (BC) nodes

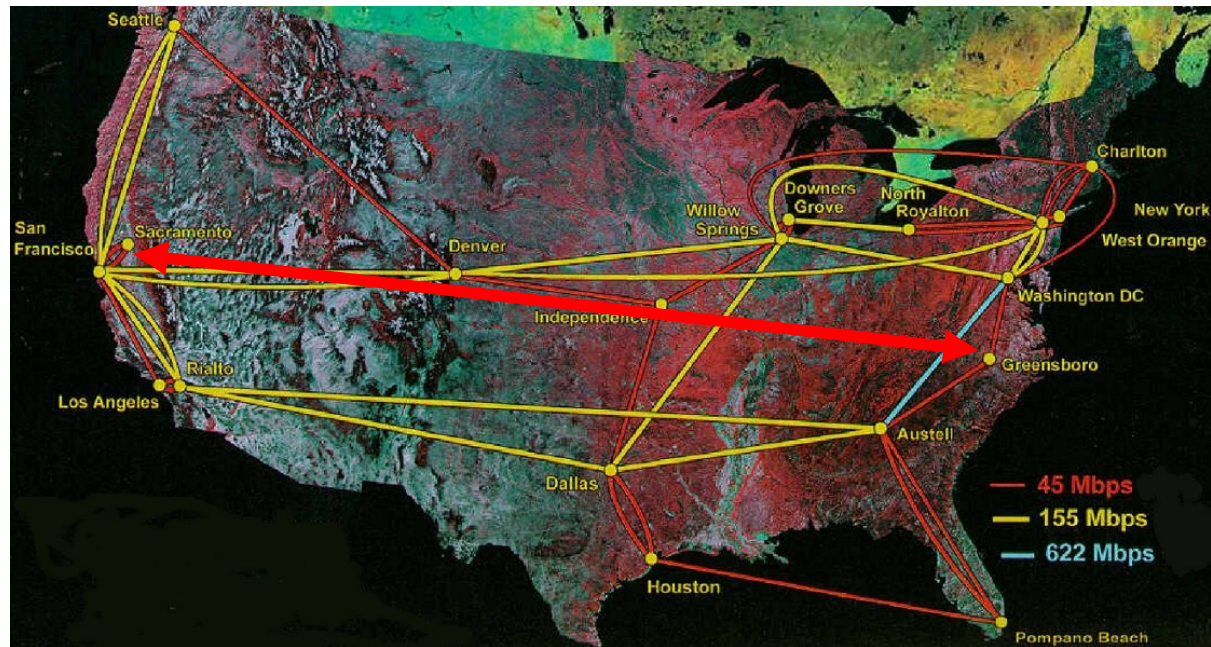


# Improving the so-far best link-addition heuristic

- MinDC heuristic adds each of the extra links between the nodes exhibiting the lowest degree
  - The **most effective** approach in terms of connectivity of the enhanced network (for synthetic and real-world Internet maps)
  - However, no constraints posed on the distance of the linked node pairs!

- **MinDC link addition:**  
Connect **Sacramento** with **Greensboro**!

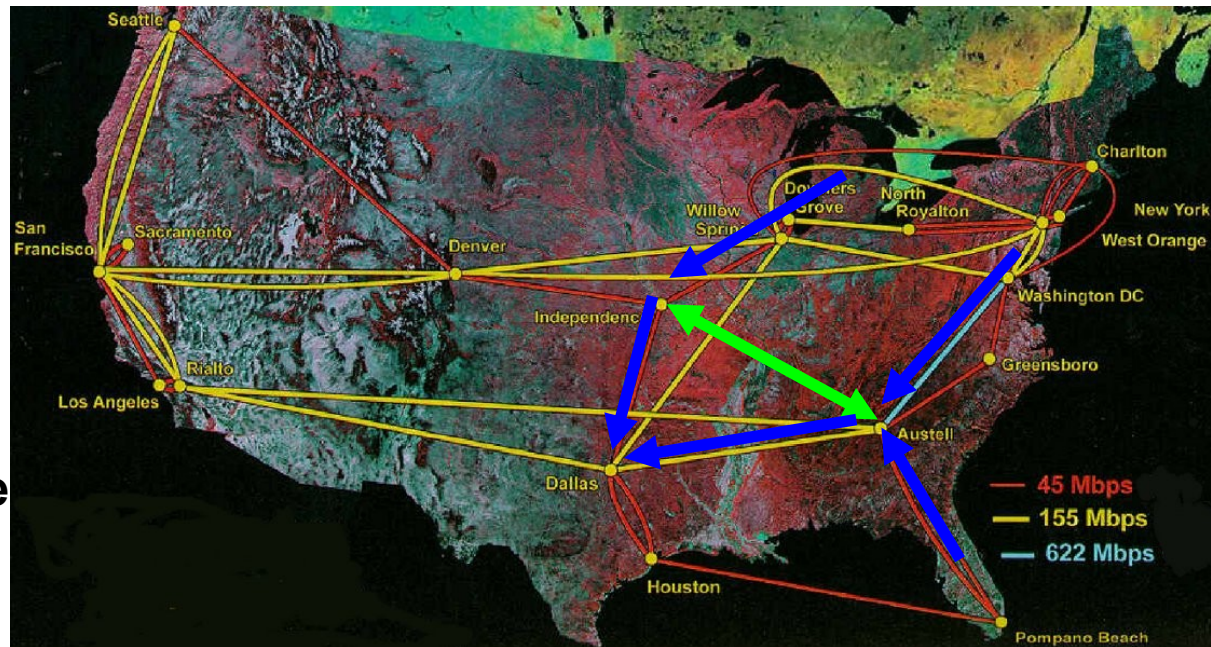
- Can we **lower** that cost and at the same time **preserve high connectivity**?



# (Revisited) problem statement and relevant intuition

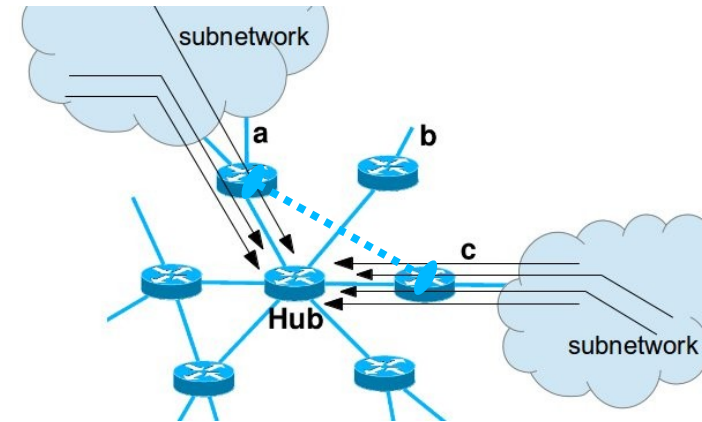
- Device a link-addition heuristic that adds  $k$  links in the network such as:
  - The connectivity of the enhanced network is improved in face of node attacks
  - The implementation cost associated with the link length be minimized
- **Idea:** Place each link only between the first neighbors of the network hubs (e.g., Dallas)

- Identify first neighbors that help establish many communication paths towards the hub
- Thus link **Independence** with **Austell!**



# Link-utility metric to select which first neighbors of a hub to connect

- Which first neighbors of a hub to connect?
  - Those that aggregate the most shortest paths from the rest of the network
  - Establishing a link between nodes 'a' and 'c' a large number of nodes are expected to remain connected should the Hub be removed
- Conditional betweenness assesses to what extent a node acts as a shortest path aggregator



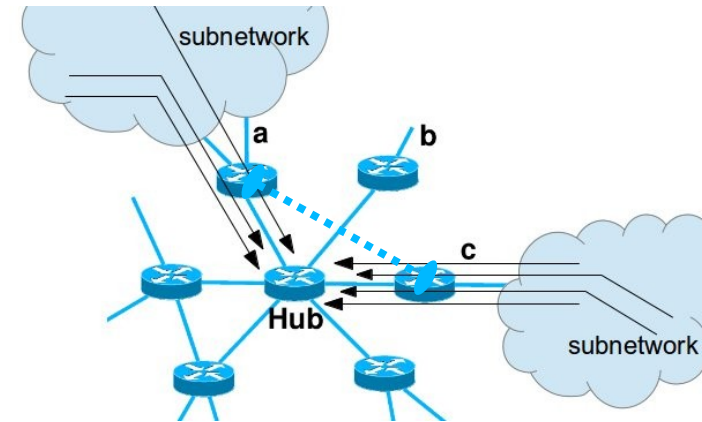
$$CBC(n; t) = \sum_{s \in V \setminus \{t, n\}} \frac{\sigma_{st}(n)}{\sigma_{st}}$$

ratio of all shortest paths  $\sigma_{st}$  towards target node  $t$ , over those that pass through node  $n$   $\sigma_{st}(n)$



# Link-utility metric to select which first neighbors to connect

- The sum of the CBC values of each pair of the first neighbors of a hub is a meaningful measure of the utility of the corresponding link



- Given the H top hubs, how to assign the available k links to each hub?

- Link-utility metric 
$$LU_{Hub}^{ij} = \frac{CBC(i; Hub) + CBC(j; Hub)}{\sum_{n \in N_g} CBC(n; Hub)} \cdot \frac{DC(Hub)}{DC_{max}}$$

Proved to be constant for each network node

As attacks take place over nodes of decreasing degree, higher utility is assigned to relatively high-degree nodes

- Assignment: Use one link to connect each of the k top LU node pairs



# Intra-domain network topologies

- `mrinfo` topologies (76-1240 nodes, 11 snapshots)
  - Snapshots correspond to Tier-1 and Transit ISPs
  - Collected during 2004-08 using a multi-cast discovering tool
- `Rocketfuel` topologies (41-2515 nodes, 6 snapshots)
  - Widely used in experimental studies
  - 800 vantage points as `traceroute` sources
- Topology-Zoo (27-92 nodes, 5 snapshots)
  - 2011 dataset reported directly by network operators of academic and research networks
  - Geographical coordinates for all their nodes



# Experimentation methodology

- Compare the introduced LU-heuristic against the so-far most effective minDC (connects minimum degree nodes *regardless of their location* )
- Enhance each topology adding an extra 5% of its total links
- “Attack level”: percentage of total node removed (set to 3%)
  - LU-heuristic: first we set “attack level” =  $H$  (as if the number of hubs can be estimated), then we relax this assumption
- Study **connectivity** of the enhanced topology as node attacks evolve in terms of:
  - Giant connected component (GCC)
  - Number of components
  - Average shortest-path length
- Study **implementation cost** in terms of the length of added links

Assumption: cost is proportional to length  
Valid yet not always accurate

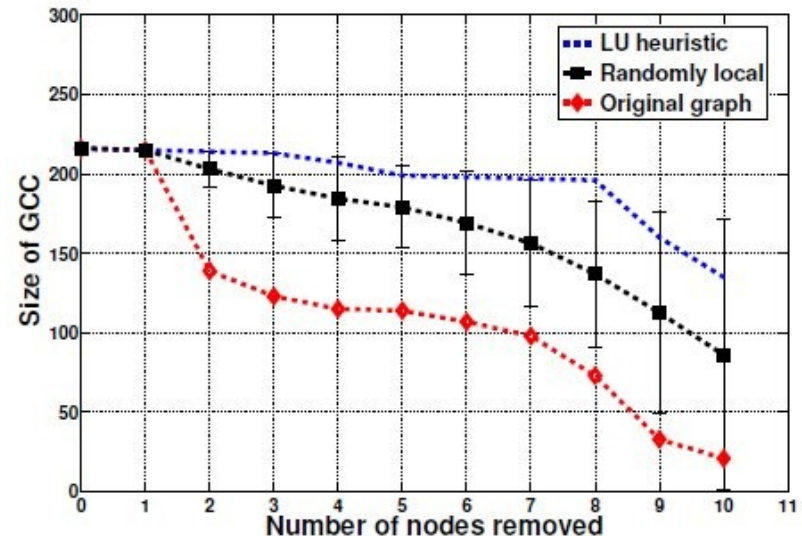




# Linking high-utility first neighbors: proof-of-concept

- Does the LU-heuristic identify the appropriate first neighbors of a hub?
- Comparison with random selection of the first neighbors in terms of connectivity (GCC size)

- `mrinfo` snapshot (216 nodes)
- Attack level ~5%
- Add an extra 5% of the total links



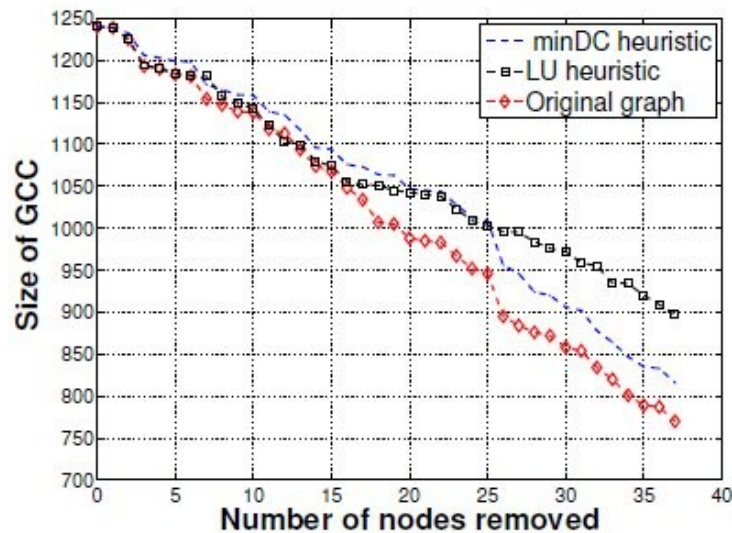
- Results validate:
  - the intuition about the criticality of neighbors establishing many paths towards a hub
  - the effectiveness of the link-utility to capture this notion



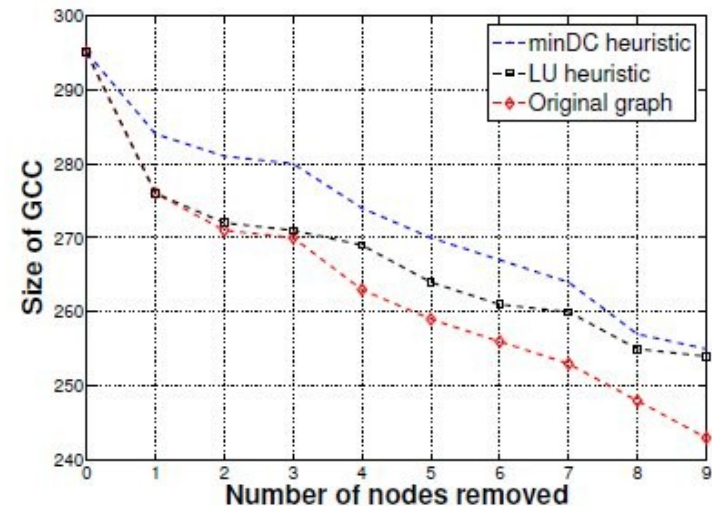
# Robustness comparison of enhanced networks (1/3)

- GCC size of the enhanced networks by minDC and LU-heuristic
- The two heuristics perform almost similarly (difference is no larger than 3.5%)
- The original network suffers from rapid fragmentation

mrinfo snapshot (ID50, 1240 nodes)



Rocketfuel snapshot (ID61, 295 nodes)

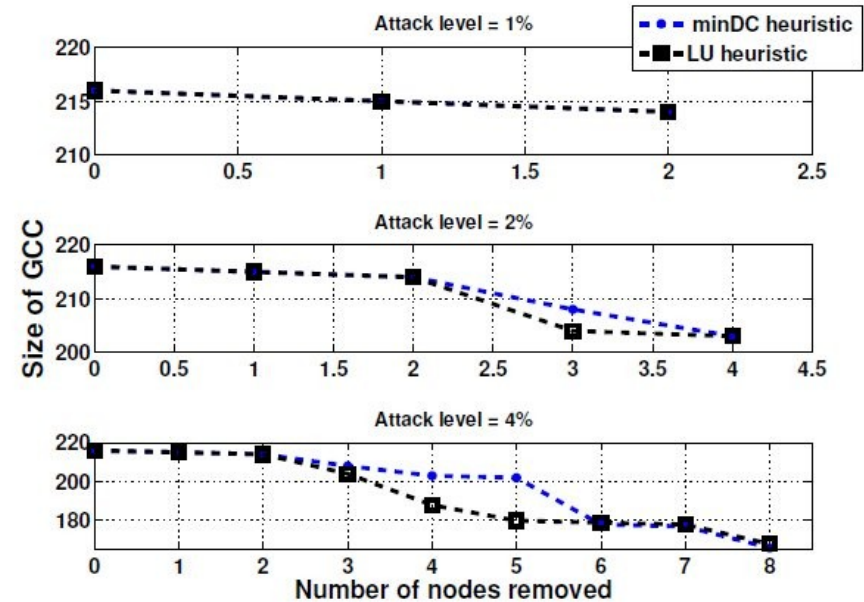


- The LU-heuristic remains effective regardless the network size!



# Robustness comparison of enhanced networks (2/3)

- Realistic malicious attacks would target 2 or 3 network hubs
- It takes a higher number of node removals for the GCC differences to become significant
- As the number of removed nodes (e.g., attack level) increases, the number of the considered LU values increases as well
- However the distribution of the  $k$  links to the  $H$  hubs performed by the LU-heuristic, remains effective



mrinfo snapshot (ID21, 216 nodes)



# Robustness comparison of enhanced networks (3/3)

- General case: parameter  $H$  is not equal to the attack level, but to the total nodes (*i.e.*, the number of attacked hubs is not known/estimated)

- Compute the relative GCC difference as node  $l$  is removed

$$\Delta^l = |GCC_{minDC}^l - GCC_{LU}^l| \cdot 100 / |V|$$

- For each topology we have  $S_{DIF} = \{\Delta^1, \dots, \Delta^m\}$  with  $m = 3\%|V|$

	Dataset ID					
	33	20	9	61	62	63
$mean\{S_{DIF}\}$ (%)	0.68	3.92	4.1	5.8	7.9	0.66
$max\{S_{DIF}\}$ (%)	1.14	19.2	7.2	13.9	14.5	1.98

- Link utility uses the ratio  $DC(l)/DC_{max}$  to appropriately assign the  $k$  links (*i.e.*, few links to small degree nodes)

- Looking closer: heuristics achieve similar connectivity levels for the first few removals

Below 7% across the 10 first removals



# How much do the link-addition heuristics cost?

- Topology-Zoo dataset: parse it to retrieve each nodes coordinates
- Distance of node pairs over the globe determined by an online tool\*
- Detailed results over the GEANT research network:
  - The minDC heuristic connects nodes of longer distance
  - LU-heuristic yields **1.3 times lower cost** than minDC

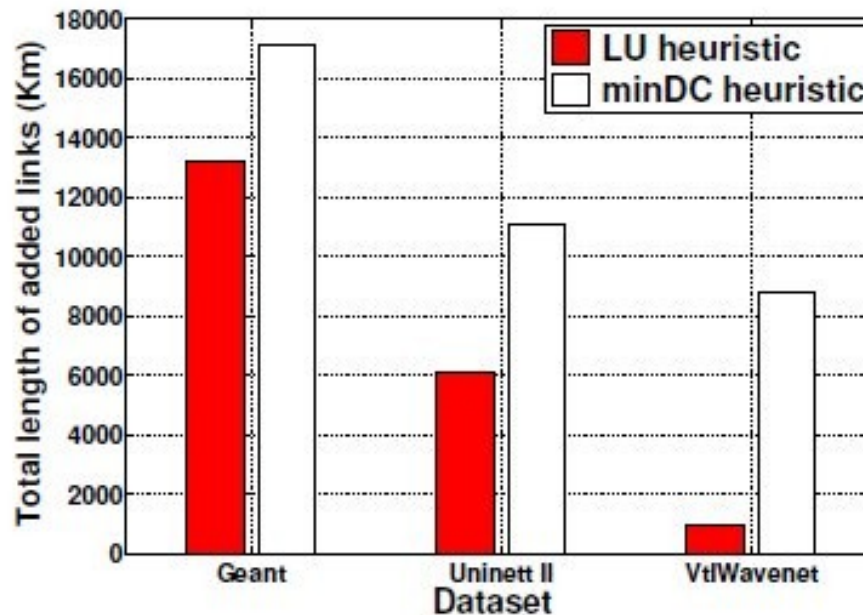
minDC heuristic				LU-heuristic			
Node pair connected	Longitude	Latitude	Link length (km)	Node pair connected	Longitude	Latitude	Link length (km)
27	-21.89541	64.13548	2270	4	16.96667	1.0308	2733
32	22.26869	60.45148		13	34.75	31.5	
13	34.75	31.5	4063	13	34.75	31.5	3195
28	-6.26719	53.34399		3	12.56553	55.67594	
19	-9.13333	38.71667	2094	14	14.42556	35.90917	1712
23	14.50513	46.05108		12	33.36667	35.16667	
27	-21.89541	64.13548	1492	1	4.88969	52.37403	2147
28	-6.26719	53.34399		26	37.61556	55.75222	
13	34.75	31.5	3778	12	33.36667	35.16667	2142
30	25.46816	65.01236		24	14.28611	48.30639	
25	26.8	53.76667	727	1	4.88969	52.37403	710
26	37.61556	55.75222		6	14.42076	50.08804	
7	6.13	49.61167	2727	6	14.42076	50.08804	596
12	33.36667	35.16667		7	6.13	49.61167 <sup>1</sup>	
			Total length: 17151 km				Total length: 13235 km

\*U.S. National Weather Service (NWS) <http://www.nhc.noaa.gov/gccalc.shtml>



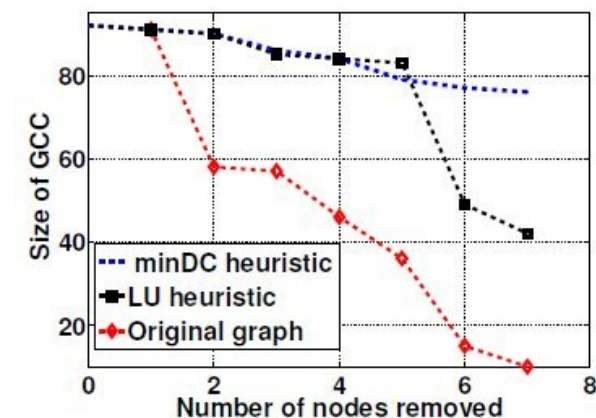
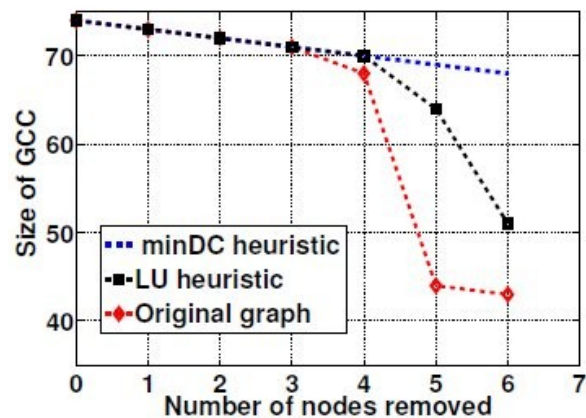
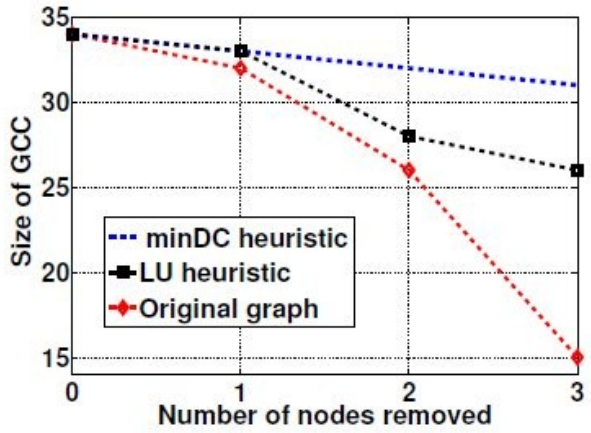
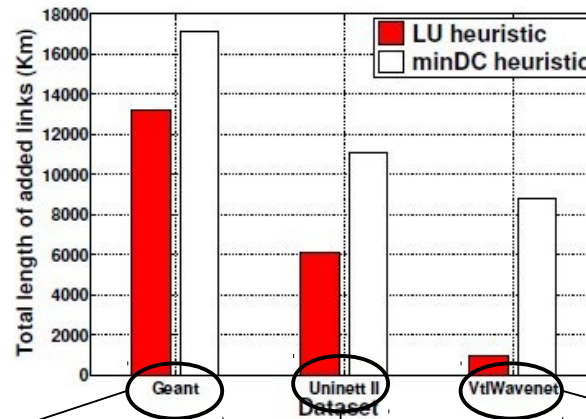
# How much do the link-addition heuristics cost?

- Similar trend over the rest snapshots: LU-heuristic yields considerably lower cost
- Noteworthy result: **8.8 times lower** cost than minDC over the cross-European VtIWavenet network (100 nodes)



# Comparison in terms of cost and connectivity

- The LU-heuristic keeps the network connectivity at (almost) the same GCC level as the minDC



# Noteworthy remarks

- Link-utility requires global network information: Is it feasible?
  - We have adopted a network operator's view (e.g., an ISP)
  - Typically an ISP possess global topological knowledge
- What is the CBC computational cost?
  - Offline CBC computations with respect to the  $H$  hubs in order not to place extra burden to the link addition
  - $H \cdot O(|E|)$  time complexity,  $H \leq |V|$  (length and # of shortest paths from a source to all nodes takes  $O(|E|)$  for unweighted graphs)
- Do the presented results realistically reflect Internet robustness?
  - A question of how accurate are the network discovery tools
  - Highest credibility achieved by using three different datasets
  - Our results are “worst-case” due to the underlying hidden redundancy





# Take-home results

- We *revisit* the mitigation of Internet hub-node attacks to account for costs : with a budget of  $k$  links, identify the network node-pairs that their connection
  - Preserves high connectivity levels
  - Yields low cost (in terms of link length)
- Contrary to previous approaches we *by-design* restrict the nodes-to-be-linked to the first neighbors of each hub
- We introduce a *novel* link-utility metric that uses centrality insights to quantifies whether a node pair aggregates many paths towards a hub
- Employing more than 20 real-world Internet topologies we show that the proposed link-addition heuristic:
  - achieves similar connectivity levels to the so-far winner method
  - induces up to 8 times lower cost



# Thank you!

## Questions ?



# Back up slides





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