

A decorative graphic on the left side of the slide consisting of two overlapping parallelograms. The front one is blue and the back one is light green, both with a slight 3D effect.

The Lightning Network

A complex network diagram representing the Lightning Network. It features numerous blue nodes (circles) connected by thin blue lines (edges). The nodes are organized into several dense, interconnected clusters, with some smaller, more isolated groups scattered at the bottom of the image.

Julius Wu, Vic Dhand, Zack Dupont, Susheel Palakurthi

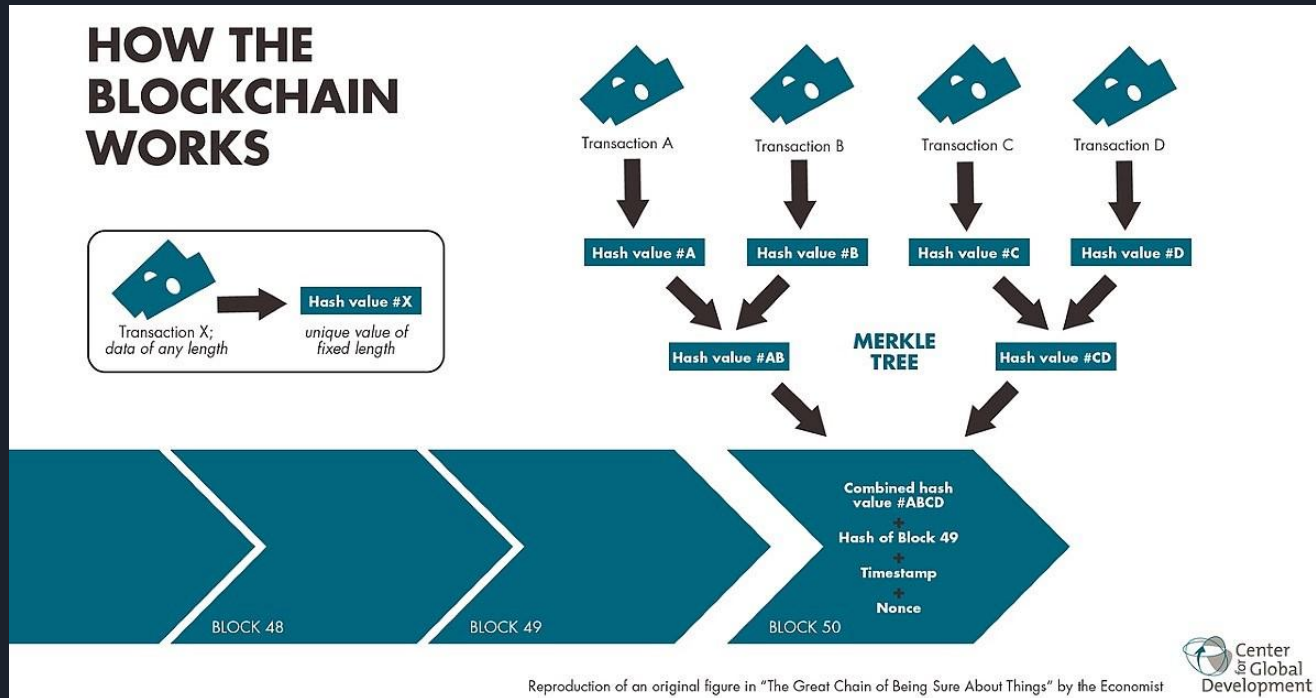
What is Bitcoin?

- Currency created in 2009 by Satoshi Nakamoto (pseudonym)
- Peer-to-peer transactions designed to eliminate the need for a financial institution
- 1 Bitcoin = 9440.09 Canadian dollars



What is Blockchain?

- Continuously growing list of records, known as blocks
- Blocks are linked securely using cryptography



Bitcoin Scalability Problem

- 1mb block size limit
- Time to create new blocks
- Maximum number of transactions per second
- The Solution: The Lightning Network



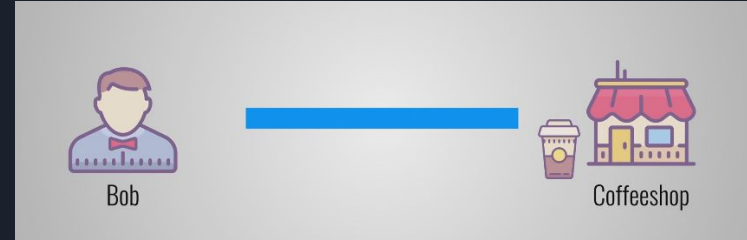


What is the Lightning Network (LN) ?

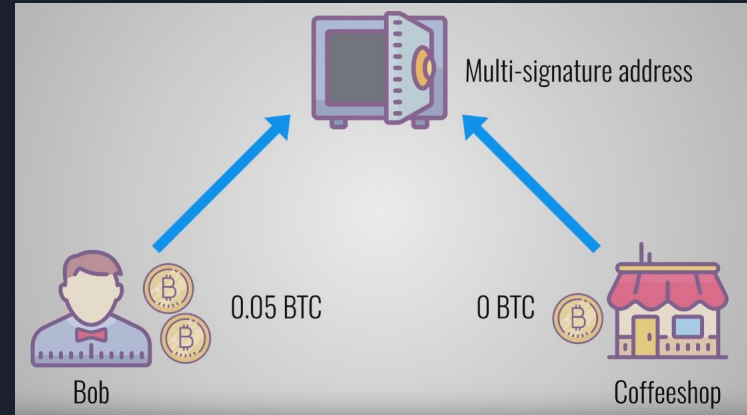
- Proposed by Joseph Poon & Thaddeus Dryja
 - <https://lightning.network/lightning-network-paper.pdf>
- Specifications for a payment channel on top of the bitcoin blockchain
- “Layer 2” solution to the Bitcoin scalability problem
- Decentralized, High Volume, Instant Micropayment

How does it work?

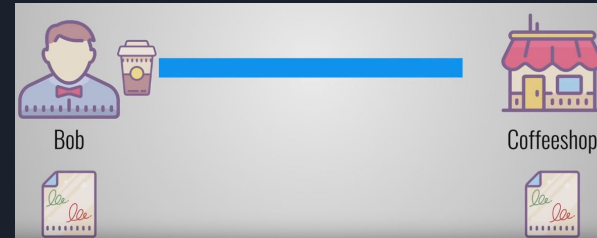
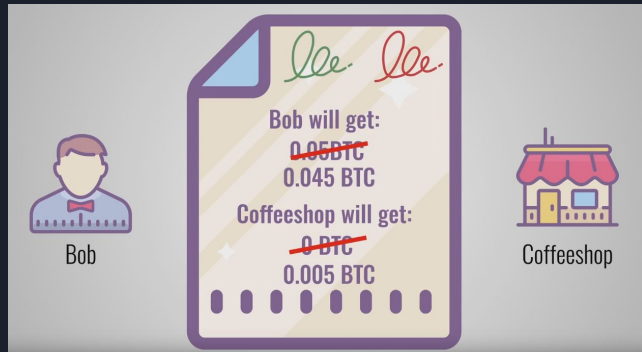
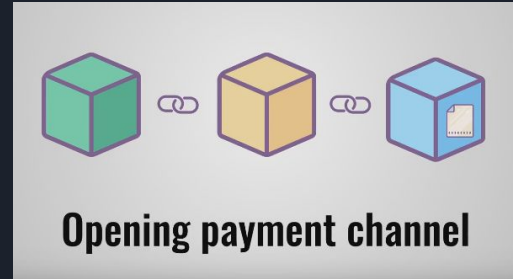
Set up a payment channel



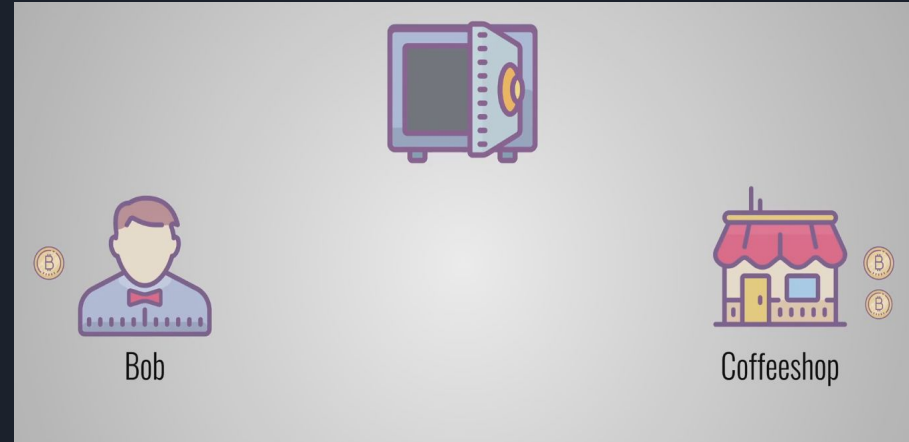
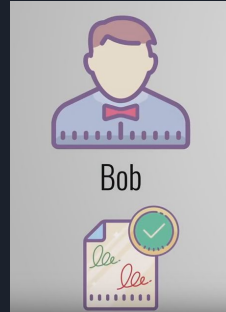
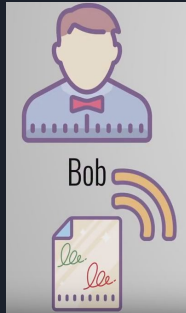
Both Bob and the Coffee Shop deposit bitcoin into a Multi-signature address



How does it work?



How does it work?



How does it work?

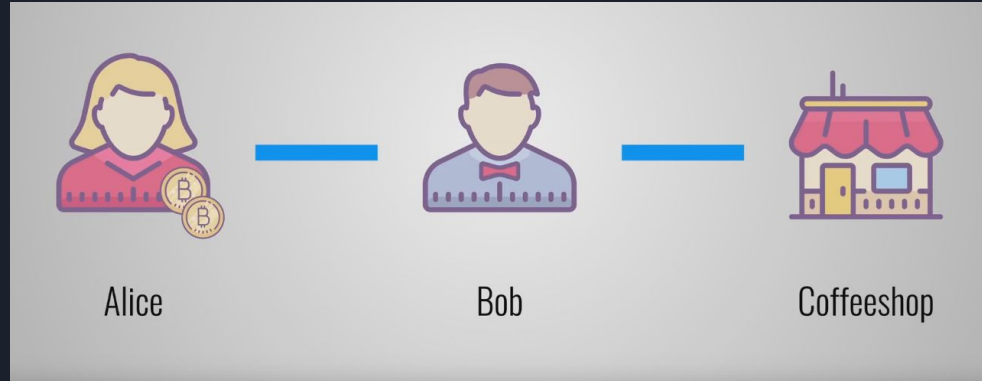
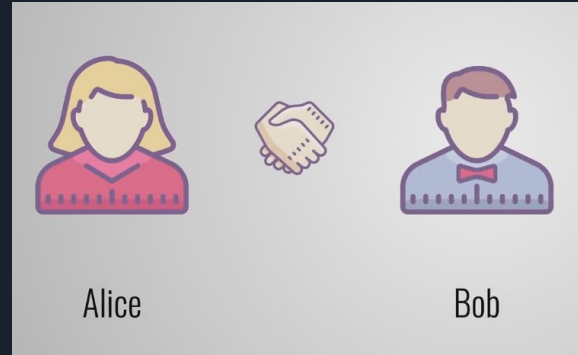


Reduced load on blockchain!

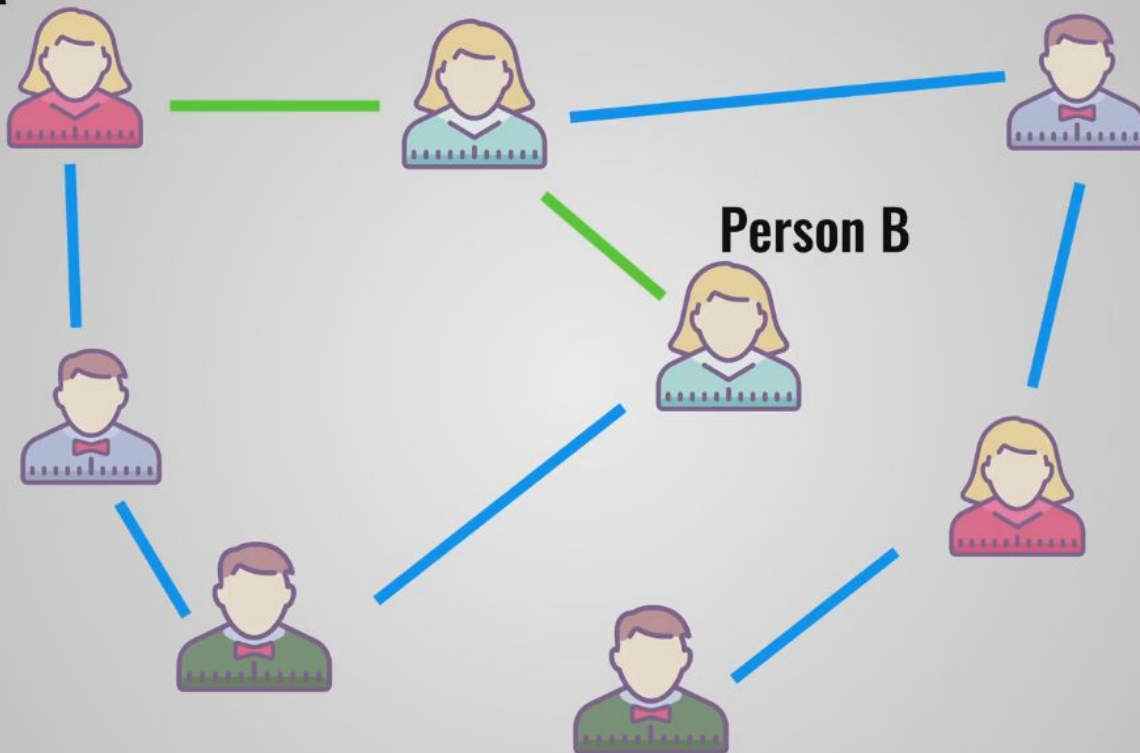


Only the latest balance sheet is valid

How does it work?

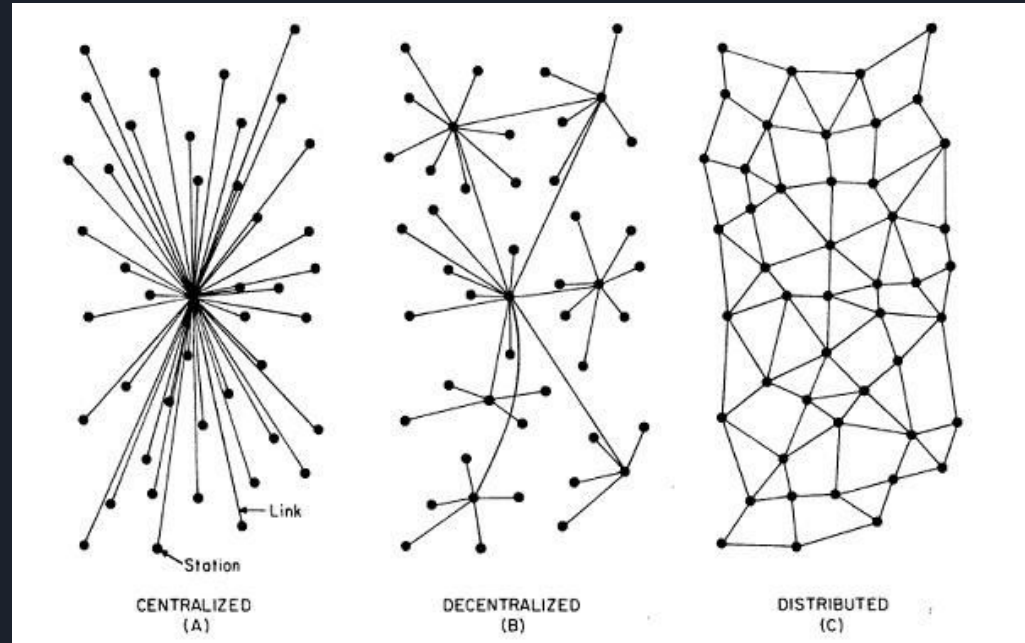


Person A



Difference between “Centralized”, “Decentralized” and “Distributed” network

- Centralized: One node does everything
 - i.e. bank system
- Decentralized: have multiple “hubs” connecting to multiple nodes.
 - i.e. Lightning network
- Distributed: nodes are only connected to peers, no hubs or central node.
 - i.e. peer 2 peer projects (blockchain)



Raw Data

- <https://shabang.io/>
- Updates every 15 min
- Our data was collected March 19, 2018 at 4:38 PM.
- Original data file downloaded: nodes.json , channels.json, stats.json
 - nodes.json : source, destination, short_channel_id, flag, active, public, last_update, base_fee_millsatoshi, fee_per_millionth, delay
 - channels.json: nodeid, alias, color, last_timestamp, addresses, port
 - stats.json: height, lightning_node, lightning_channel, segwit_input, total_input, lightning_channels_funded
- 843 nodes , 4779 channels, 514312 blockheight (at the time the data was collected)



Data cleaning

- Convert all 3 files from .json into .csv files
- Discard stat.csv (not used for our project)
- Reducing 843 nodes into 381 nodes
 - Subsetting the nodes data with proper IP address (removing data with unknown IP addresses)
 - Eliminating all missing data and encrypted data
- Geo-locate each of the nodeid
 - Converting IP addresses into continent, country, region, city, longitude and latitude coordinates
- Reformat the data column names and combine based on the nodeid, source and destination
 - nodes.csv: source, target, weight (base fee in mill-satoshi)
 - edges.csv: nodeid, alias, latitude, longitude

```
> head(nodes)
```

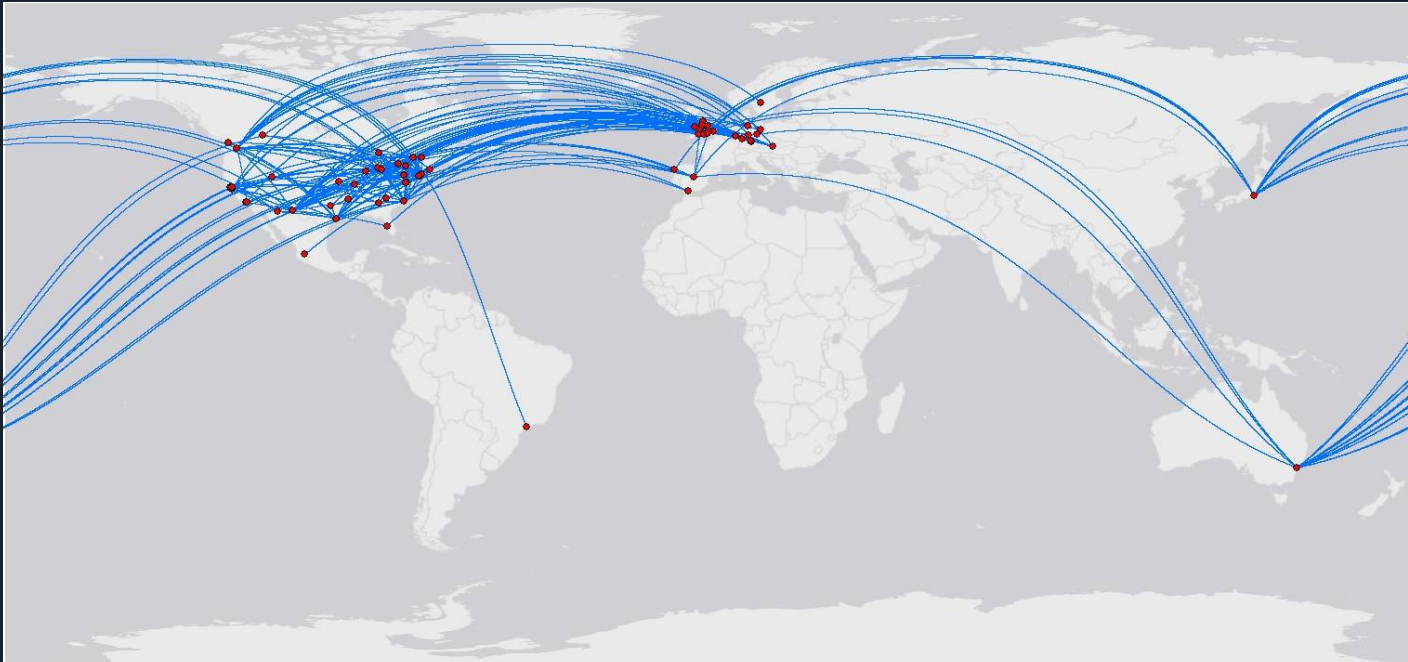
	nodeid	alias	color	last_timestamp	addresses.0.type	addresses.0.address	addresses.0.port	addresses.1.type	addresses.1.address	addresses.1.port
1	03b7d8b6bbaf02239277ed32378d50d29840292b61d516d30057b74044992c93dd	ALIBABA	0066cc	1518572211	ipv4	173.212.218.204	9735			NA
2	0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0	Nick's LND Node	551a8b	1521501156	ipv4	51.6.89.26	9735			NA
3	03b3b683a829e3ba10c68b9952fc348460f991735859b93deac3acc2dbcbe412fe	neowisard	03b3b6	1520973153			NA			NA
4	032a16a13ffc9cb7c2e06d99d3c0d57cb140426d1ce80084afd2bef6078fd5c72a	STRANGELHISPER	032a16	1516675975			NA			NA
5	03e3d670d86f33181ee7451f14998b376a0d5deba8ab064b4ebe5ad5706f7b112b	CN_Pek_HappyHome	ff0000	1518465126	ipv4	222.129.253.32	9735			NA
6	023daf469bbf2d5769d7673b66a841bd6d46452a4e20be548c6b11da730e5db575	SILENTRUTE	023daf	1520645230	ipv4	193.224.22.11	9735			NA

```
> head(channels)
```

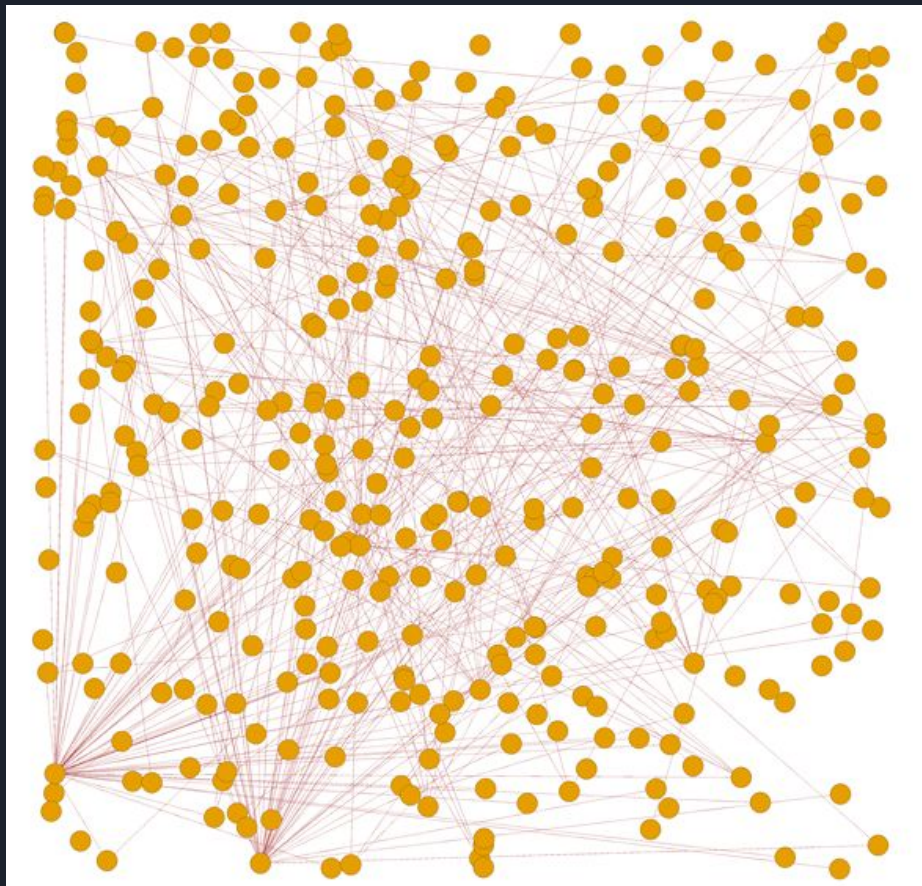
	source	destination	short_channel_id	flags	active	public	last_update	base_fee_millisatoshi	fee_per_millionth	delay
1	03b7d8b6bbaf02239277ed32378d50d29840292b61d516d30057b74044992c93dd	020d3d5995a973c878e3f6e5f59da54078304c537f981d7dcef73367ecbea0e90e	509070:571:0	1	false	true	1518717986	1000		10 14
2	0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0	02ad411014bb942951d30cef65c6e99aa66f05fd383d25748f78782f07f32f8fb2	514269:320:1	1	false	false	NA	NA		NA NA
3	0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0	0207481a19a3f51a48f134e95afa67cfeffdb38a99b5ad3494a320c4918aaaf579	514306:1709:0	1	true	true	1521500944	1000		1 144
4	0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0	027ccce61f4bf1fafb5156931da6527dc104ec3613dd4f4050161d89dd76ab494c	514307:84:1	1	true	true	1521500548	1000		1 144
5	03b3b683a829e3ba10c68b9952fc348460f991735859b93deac3acc2dbcbe412fe	02f6725f9c1c40333b67faea92fd211c183050f28df32cac3f9d69685fe9665432	512239:1154:1	1	true	true	1520972998	1000		10 14
6	03b3b683a829e3ba10c68b9952fc348460f991735859b93deac3acc2dbcbe412fe	0371190acf2e92bd1faa6ce4d12ff248798515a92ac903ac14d31b5172d9b2917	512256:1573:0	1	true	true	1520972997	1000		10 14

Lightning Network - World Map (ArcMap)

- Asia (9 nodes), Europe (48 nodes), North America (323 nodes), South America (1 node)
- 307 nodes are in United States of America
 - Michigan has the most nodes, with its city Ann Arbor having 102 nodes



Simple Graph



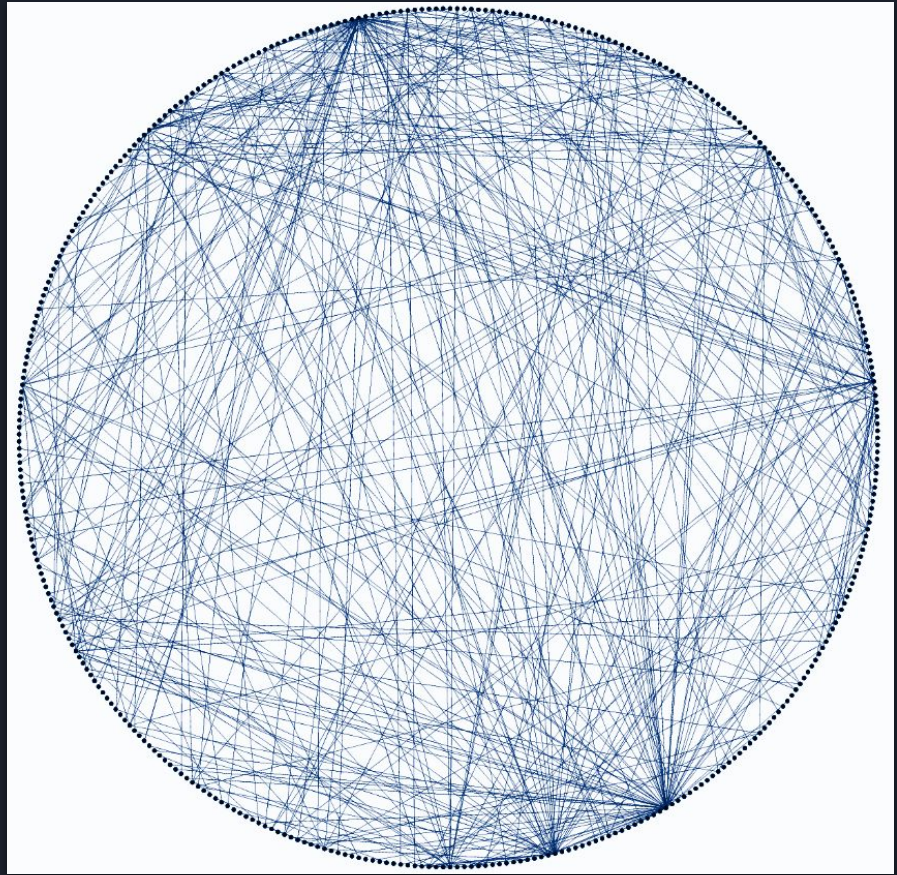
```
plot(net, layout = layout_randomly, vertex.label = NA, vertex.size = 5, edge.lty = 1,  
     edge.color = "brown", axes = TRUE, edge.arrow.mode = 0, frame = TRUE, main = "Simple graph")
```


Fruchterman-Reingold



```
#Plotting with Fruchterman-Reingold algorithm  
l3 <- layout_with_fr(net)  
plot(net, layout = l3, vertex.label = NA)
```

Circle Graph



```
l <- layout_in_circle(net)
plot(net, layout = l, vertex.size = 1, edge.lty = 1, edge.color = "brown",
      vertex.color = "blue", axes = TRUE, edge.arrow.mode = 0, frame = TRUE,
      main = "Circle Graph", vertex.label = NA)
```

Degree of a vertex

```
degree(netGraph, v = V(netGraph), mode = c("all"), loops = FALSE, normalized = FALSE)
```

```
03b7d8b6bbaf02239277ed32378d50d29840292b61d516d30057b74044992c93dd 0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0
2 0
0267db6fbe76e1fbae50e27529a330837e9e1f4b9e4c7bbfefcd7d6a1b3ffe2b245 026b4f8931fcf87033d0f601ad7e4baa8e93ee74acf313292fd397fd6c27524162
0 4
03efeea8961f376931a390ed9ae62be116abc1a8abaad6d1998efcc11d63e86526 0207197d1028b8a7edfee28f4e2dc47905333b2c4f9ed40bcd2c7481abe8fb049a
8 8
0235447c7485ff2b945bac5fbc366d54a87389bab8cacf1b64b26ec01e96bd165a 0323e18348bb2afc29660da8ba06fb1e91fc37a5752301180b8f3afca7f5c49f01
26 0
02c119d2fd2e98a88f50d0d2ee4213255b7b8ec2be3a95f9aabdd6afb09dd25b083 03587e75c5928c0bdaae3b100f3edf7211bfd900d08a93f391e7d20fe062eeb37c
38 2
0208b6ec8c4c77cabef8351f92327c13e0b7cc2e3724083669de305e2b395341fe 0226b317ebf63a888838c2900b0e77e45b3ad35c59bdbbd6a8eaba0c0362303cee
0 0
033ac2f9f7ff643c235cc247c521663924aff73b26b38118a6c6821460afcd1b3 02b7060f74b7e04d3d8af97fab20381fcc16f7a33c7e526fa5c9b96afdb288d7d2
8 10
02a90ee457ad397e5e882780b1fa0d109c3b66479d38e7682f5ee75fe995800f8e 03cea3557a68bb4f2845808b937531e8666b16724e1d5f24215d9234efc5a57e7d
2 2
0355cf9ce813a343313e1a4844f82c34810619943cb193cbfbeat08da15d80fb98 0392e78c508987c97de70b2474493e9b0dbbd0dcad69dec2648d686701da1df44a
0 2
```

Top 3 Results:

020d3d5995a973c878e3f6e5f59da54078304c537f981d7dcef73367ecbea0e90e	128
02f6725f9c1c40333b67faea92fd211c183050f28df32cac3f9d69685fe9665432	100
021f2cbffc4045ca2d70678ecf8ed75e488290874c9da38074f6d378248337062b	54



Global Clustering coefficient

$$C = \frac{3 \times \text{number of triangles}}{\text{number of connected triplets of vertices}} = \frac{\text{number of closed triplets}}{\text{number of connected triplets of vertices}}.$$

```
> # Clustering coefficient (transitivity of a graph)
> transitivity(netGraph, type = ( "global"), vids = v(netGraph),
+             weights = E(netGraph)$weight, isolates = c("NaN", "zero"))
[1] 0.02839833
```


Betweenness Centrality

$$g(v) = \sum_{s \neq v \neq t} \frac{\sigma_{st}(v)}{\sigma_{st}}$$

```
#Betweenness calculation
```

```
betweenness(netGraph, v = v(netGraph), directed = TRUE, weights = E(netGraph)$weight,  
nobigint = TRUE, normalized = FALSE)
```

03b7d8b6bbaf02239277ed32378d50d29840292b61d516d30057b74044992c93dd 0.00000	0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0 0.00000
0267db6f76e1fbae50e27529a330837e9e1f4b9e4c7bbfefd7d6a1b3ffe2b245 0.00000	026b4f8931fcf87033d0f601ad7e4baa8e93ee74acf313292fd397fd6c27524162 6.50000
03efeea8961f376931a390ed9ae62be116abc1a8abaad6d1998efcc11d63e86526 1311.23177	0207197d1028b8a7edf7e28f4e2dc47905333b2c4f9ed40bcd2c7481abe8fb049a 604.26638
0235447c7485ff2b945bac5fbc366d54a87389bab8cacf1b64b26ec01e96bd165a 8011.68002	0323e18348bb2afc29660da8ba06fb1e91fc37a5752301180b8f3afca7f5c49f01 0.00000
02c119d2fd2e98a88f50d0d2ee4213255b7b8ec2be3a95f9aabd6afb09dd25b083 4652.37868	03587e75c5928c0bdaae3b100f3edf7211bfd900d08a93f391e7d20fe062eeb37c 0.00000
0208b6ec8c4c77cabef8351f92327c13e0b7cc2e3724083669de305e2b395341fe 0.00000	0226b317ebf63a888838c2900b0e77e45b3ad35c59bdbbd6a8eaba0c0362303cee 0.00000
033ac2f9f7ff643c235cc247c521663924aff73b26b38118a6c6821460afcde1b3 280.40898	02b7060f74b7e04d3d8af97fab20381fcc16f7a33c7e526fa5c9b96afdb288d7d2 112.66667
02a90ee457ad397e5e882780b1fa0d109c3b66479d38e7682f5ee75fe995800f8e 0.00000	03cea3557a68bb4f2845808b937531e8666b16724e1d5f24215d9234efc5a57e7d 0.00000
0355cf9ce813a343313e1a4844f82c34810619943cb193cbfbbead08da15d80fb98 0.00000	0392e78c508987c97de70b2474493e9b0dbbd0dcad69dec2648d686701da1df44a 0.00000
0325fd957aeaead3635d7593b56c717090f95e7808290216b452e23fb2c0d77d11 0.00000	02a0f1e7defe594d4f89e056ac45dbc3c2bdb29480270ed11c11040128a4ca6285 91.66667
0388157a19ed80015b64bf9cd3cbc3c3c4492822341ab7813c7f9c0dbccc08fb26 0.00000	035ec1f8ea7d376385dfa7c92bd9a0c43e1c88a4058179c3a80ac68abc27dd2389 0.00000



Betweenness Centrality

Top 3 Results:

020d3d5995a973c878e3f6e5f59da54078304c537f981d7dcef73367ecbea0e90e	27161.08
02f6725f9c1c40333b67faea92fd211c183050f28df32cac3f9d69685fe9665432	21528.95
021f2cbffc4045ca2d70678ecf8ed75e488290874c9da38074f6d378248337062b	10327.28

Edge-Betweenness

```
#Edge-Betweenness calculation
edge_betweenness(netGraph, e = E(netGraph),
directed = TRUE, weights = E(netGraph)$weight)
```

$$c_B(e) = \sum_{s,t \in V} \frac{\sigma(s,t|e)}{\sigma(s,t)}$$

[1]	255.00000	244.50000	17.00000	697.37519	295.68911	478.69884	94.46862	115.01568	355.10399	191.71221	197.43450
[12]	255.00000	237.62882	209.47108	693.75833	195.65514	104.85244	391.50878	341.19506	285.45280	665.60403	743.75000
[23]	3769.18569	373.61784	134.53611	240.88957	260.01449	86.17338	227.20390	169.88922	481.30000	212.56739	255.00000
[34]	118.10609	653.54573	255.00000	178.01268	255.00000	255.00000	441.96139	197.12019	231.05855	255.00000	255.00000
[45]	86.02857	165.82118	110.30992	173.24931	14.50000	171.00000	70.00000	74.00000	38.16667	255.00000	255.00000
[56]	1.00000	259.63810	87.02857	255.00000	173.69299	219.76997	1.00000	255.00000	255.00000	1025.82372	1052.50058
[67]	91.96941	714.40924	255.00000	108.64591	255.00000	255.00000	319.53492	66.66190	255.00000	255.00000	1.00000
[78]	255.00000	1040.17750	24.44136	145.10837	1223.13495	101.88501	255.00000	255.00000	277.00000	183.00000	616.82497
[89]	147.24525	255.00000	255.00000	35.53096	255.00000	56.00000	68.67621	63.53096	115.76367	25.90000	7.00000
[100]	255.00000	7.00000	543.69701	255.00000	55.83096	255.00000	255.00000	255.00000	315.78333	80.18333	171.03889

Closeness Centrality

```
#Closeness centrality|
closeness(netGraph, vids = v(netGraph), mode = ("total"),
          weights = E(netGraph)$weight, normalized = FALSE)
```

```
03b7d8b6bbaf02239277ed32378d50d29840292b61d516d30057b74044992c93dd 0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0
4.977259e-07 6.907031e-06
0267db6f76e1fbae50e27529a330837e9e1f4b9e4c7bbfefd7d6a1b3ffe2b245 026b4f8931fcf87033d0f601ad7e4baa8e93ee74acf313292fd397fd6c27524162
6.907031e-06 4.723398e-07
03efeea8961f376931a390ed9ae62be116abc1a8abaad6d1998efcc11d63e86526 0207197d1028b8a7edfee28f4e2dc47905333b2c4f9ed40bcd2c7481abe8fb049a
5.131284e-07 5.462723e-07
0235447c7485ff2b945bac5fbc366d54a87389bab8cacf1b64b26ec01e96bd165a 0323e18348bb2afc29660da8ba06fb1e91fc37a5752301180b8f3afca7f5c49f01
5.698132e-07 6.907031e-06
02c119d2fd2e98a88f50d0d2ee4213255b7b8ec2be3a95f9aabdf6afb09dd25b083 03587e75c5928c0bdaae3b100f3edf7211bfd900d08a93f391e7d20fe062eeb37c
5.376570e-07 4.870453e-07
0208b6ec8c4c77cabef8351f92327c13e0b7cc2e3724083669de305e2b395341fe 0226b317ebf63a888838c2900b0e77e45b3ad35c59bdbbd6a8eaba0c0362303cee
6.907031e-06 6.907031e-06
033ac2f9f7ff643c235cc247c521663924aff73b26b38118a6c6821460afcd1b3 02b7060f74b7e04d3d8af97fab20381fcc16f7a33c7e526fa5c9b96afdb288d7d2
5.073278e-07 5.196995e-07
02a90ee457ad397e5e882780b1fa0d109c3b66479d38e7682f5ee75fe995800f8e 03cea3557a68bb4f2845808b937531e8666b16724e1d5f24215d9234efc5a57e7d
4.915853e-07 4.984451e-07
0355cf9ce813a343313e1a4844f82c34810619943cb193cbfbeat08da15d80fb98 0392e78c508987c97de70b2474493e9b0dbbd0dcad69dec2648d686701da1df44a
6.907031e-06 6.877579e-06
0325fd957aeaead3635d7593b56c717090f95e7808290216b452e23fb2c0d77d11 02a0f1e7defe594d4f89e056ac45dbc3c2bdb29480270ed11c11040128a4ca6285
6.907031e-06 5.042318e-07
0388157a19ed80015b64bf9cd3cbc3c3c4492822341ab7813c7f9c0dbccc08fb26 035ec1f8ea7d376385dfa7c92bd9a0c43e1c88a4058179c3a80ac68abc27dd2389
4.977259e-07 6.907031e-06
```




Closeness Centrality

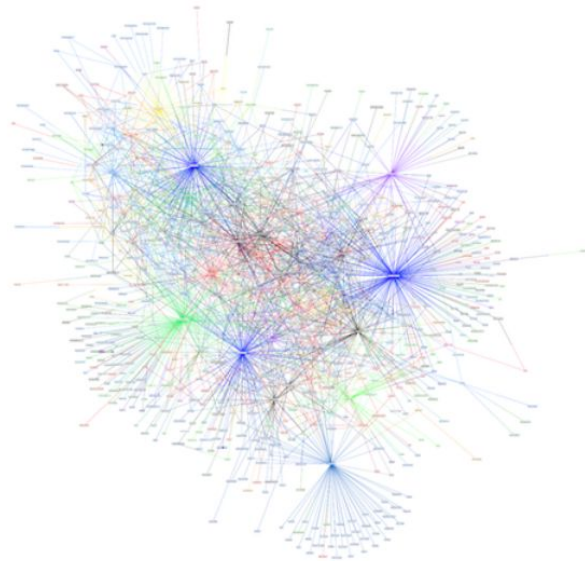
Top 3 Results:

0330c464cb2be97cd4ca5057b192a2be3c775a5f0356aced805769cb8790b879c0	6.91E-06
0267db6fbe76e1fbae50e27529a330837e9e1f4b9e4c7bbfe7d7d6a1b3ffe2b245	6.91E-06
0323e18348bb2afc29660da8ba06fb1e91fc37a5752301180b8f3afca7f5c49f01	6.91E-06

Conclusion

Lightning Network DDoS Sends 20% of Nodes Down

© March 21, 2018 12:17 pm



Lightning Network (LN) nodes faced a Distributed Denial of Service (DDoS) attack yesterday that sent offline around 200 nodes, down from around 1,050 to 870.

"Lightning nodes are getting DDOS'ed, rumor is that someone from the 2x effort known as "BitPico" has taken credit for this.

