Seven Years in the Life of Hypergiants' Off-nets

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Construct datacenters







Construct datacenters

Roll out fiber to built their backbone



--- Network





Construct datacenters

Roll out fiber to built their backbone



Network

Peer at IXPs and collocation facilities







Construct datacenters

Roll out fiber to built their backbone



Network

Peer at IXPs and **collocation facilities**

Peer directly with eyeballs





Construct datacenters

Deploy off-net servers

Roll out fiber to built their backbone



Network

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Hypergiant AS(es)



On-net: A server deployment inside the HG own network.



Hypergiant AS(es)



On-net: A server deployment inside the HG own network.







On-net: A server deployment inside the HG own network.





On-net: A server deployment inside the HG own network.

Off-net: A server deployment outside of the HG own network.





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Revisit the value of peering and how traffic flows in the Internet.







- Revisit the value of peering and how traffic flows in the Internet.
- Understand the evolution of the Internet structure.









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- Localisation of content within an Internet Service Provider (ISP).





Peering link

HG





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So, is there a generic method to uncover the off-nets of all Hypergiants?



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- - Surprisingly, yes!

So, is there a generic method to uncover the off-nets of all Hypergiants?





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18 Jul 2021 Across Google: 95%

Source: Google Transparency Report

May 01, 2021

Jan 01, 2018

Jan 01, 2020



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 - Using TLS certificates we can find the service owner.
 - Corpuses of TLS data are publicly available.





Contributions


• We developed the first technique capable of uncovering the off-net footprint deployment of all Hypergiants.



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- We applied it to map their growth from 2013 to 2021.
- We found that Google grew by 2,766 ASes, reaching 3,810 in April 2021.
- facebook and NETFLIX launched their own CDNs and now have presence in at least 2,115 ASes.





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 - 1. Business strategies.



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- In this work, we focus only on uncovering the off-net deployments.





Step 0: <u>Collect TLS certificates dataset</u>



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- Step 1: Validate Certificates
 - D



Exclude self-signed, expired and certificates with a non-verified chain.

Serial Number 0E 90 13 94 13 97 F4 0A 2D 49 69 6D 29 0F 9F E2

Signature Algorithm SHA-256 with RSA Encryption (1.2.840.113549.1.1.11)

Not Valid Before Tuesday, 20 July 2021 at 01:00:00 British Summer Time Not Valid After Tuesday, 19 October 2021 at 00:59:59 British Summer Time





- Step 2: <u>Learn Hypergiant TLS Fingerprints</u>



Valid TLS Certificates

Input the HG keyword e.g., "facebook" and the TLS scans for all on-net IPs.



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- Step 3: <u>Use Fingerprints to Identify candidate off-nets</u>
 - Search for certificates matching the on-net fingerprints.



On-net TLS Fingerprints



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- No, it does not!

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Akamai off-nets





Step 4: Learn Hypergiant HTTP(S) Fingerprints using headers



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Content-Type: text/html; charset="utf-8" **X-FB-Debug:** BsHPkKRtI6ZxkfjPftwA20vHTlx7hysdizbXq7joztLW6D9R8 Date: Wed, 04 Aug 2021 12:12:53 GMT **Alt-Svc:** h3-29=":443"; ma=3600,h3-27=":443"; ma=3600 Content-Length: 0



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HTTP/1.1 301 Moved Permanently Location: https://facebook.com/ Content-Type: text/html; charset="utf-8" X-FB-Debug: BsHPkKRtI6ZxkfjPftwA20vHTlx7hysdizbXq7joztLW6D9R8 Date: Wed, 04 Aug 2021 12:12:53 GMT **Alt-Svc:** h3-29=":443"; ma=3600,h3-27=":443"; ma=3600 **Connection:** keep-alive Content-Length: 0





HTTPS header Fingerprint



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- Step 5: <u>Confirm Candidates Using HTTP(S)</u>
 - Apply the HTTP(S) fingerprints to the off-net candidates and classify as off-nets any that match the HG fingerprints.



HTTP header Fingerprint



HTTPS header Fingerprint



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HTTPS header Fingerprint



Candidate off-net server deployments



Off-net server deployments





- The TLS certificate reveals if an IP hosts a service for the Hypergiant.
- HTTP(S) header reveals who operates the server.
- The IP address reveals if it is an on-net or off-net server.



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- To consider a server as a Hypergiant off-net deployment:
 - TLS certificate and HTTP(S) headers must map to the Hypergiant.
 - The IP address is not part of the Hypergiant own network.



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TLS certificate scans:



collects certificates in IPv4-wide scans on port 443.


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+ Custom active scan.



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- TLS certificate scans:
 - RAPID
 - Quarterly snapshot from Oct. 2013 to Apr. 2021.
 - Censys

+ Custom active scan.

- HTTP(S) headers (Validation):
 - from Oct. 2013 to Apr. 2021.

collects certificates in IPv4-wide scans on port 443.

We used corpuses of available HTTP(S) headers from **RAPID**





Google



facebook







Google



Differences between only-certificates and &/or HTTP(S) are minimal.

facebook





Google



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facebook



we are able to identify more ASes.







Off-net footprint growth for top-4 HGs (Google, Facebook, Netflix and Akamai) over time.





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Longitudinal Growth (2013-2021)



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We label the ASes hosting off-nets based on their customer cone size*.



- We consider 5 categories of ASes:

We label the ASes hosting off-nets based on their customer cone size*.





Growth of Google's off-net footprint grouped by AS customer cone size.





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• 4x increase in Stub, Small and, Medium ASes.







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Growth significantly increase after the open of the economy.









Growth of Netflix and Facebook off-net footprints grouped by AS customer cone size.





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Birth of HG CDNs.

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- Similar contributions of different types of networks.
- Significant increase after the lockdown.









Growth of Akamai's off-net footprint grouped by AS customer cone size.





Growth of Akamai's off-net footprint grouped by AS customer cone size.

Contribution of stub ASes since 2018 decline.







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Contribution of small & medium remain stable.







Growth of Akamai's off-net footprint grouped by AS customer cone size.

Contribution of stub ASes since 2018 decline.

Contribution of small & medium remain stable.

Sum of stub, small and medium remains 84%.





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Regional Growth



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Growth of top-4 HGs (plus Alibaba) in Asia and South America continent over time.



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 Significant increase of all HGs (except Akamai) in all regions.


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• Significant increase of all HGs (except Akamai) in all regions.

Exponential growth in Asia and South America.

Regional growth of some HGs (e.g., Alibaba in Asia).



Source: How Big is that Network? | labs.apnic.net 24





 APNIC conducts measurement campaigns (Google Ads) to estimate the user population per AS.



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Source: How Big is that Network? | <u>labs.apnic.net</u> 24





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- The only available dataset that provides this type of information.
- Daily snapshots from October 2017 to date.

Source: How Big is that Network? | labs.apnic.net 24







Facebook's off-net footprint user coverage (%).









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Example: Facebook in 2017 announced that it had plans to expand in Africa





- and other developing regions.
- Our analysis reflect that they achieved this goal.

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Hypergiants' off-nets Expansion Internet User Population Coverage <u>based on customer cone</u>



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% of a country's Internet users **including** and **excluding** the customer cones of ASes hosting Facebook off-nets (April 2021).



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27% increase in global user coverage



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What-If #1: Serving into the customer cone noticeably expands coverage in parts of Africa, Asia, Europe and South America.



Hypergiants' off-nets Expansion Internet User Population Coverage based on customer cone

27% increase in global user coverage



% of a country's Internet users including and excluding the customer cones of ASes hosting Facebook off-nets (April 2021).

- What-If #1: Serving into the customer cone noticeably expands coverage in parts of Africa, Asia, Europe and South America.
- by deploying off-nets in only 5 ASes.

What-If #2: Facebook coverage could significantly increase in the US from 33.9% to 61.8%







ASes that host at least one top-4 HGs.

 More than 97% of ASes hosting off-nets, host at least one of the top-4 HGs.







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 - In 2021, more than 70% of ASes with off-nets host 2-4 top-4 HGs.
 - In 2013, it was less than 30%.
- A networks that already hosts one of the top-4 HGs is likely to later host more.











Validation from Hypergiants.



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 - 89-95% of ASes hosting their off-nets.

Four replied to our survey, all of them indicated that we correctly uncovered



- Validation from Hypergiants.
 - 89-95% of ASes hosting their off-nets.
- **Comparison to Earlier Results.**
 - Google: Previous study in April 2016 reported 1445 ASes. We identified 98% of them, plus 283 additional ASes.
 - facebook : Comparison with three studies: We identified 96% (2018), 94% (2019) and 95% (2021) of the ASes.

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NETFLIX : Previous study in May 2017 reported 743 ASes, we report 769 ASes.





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 - Multiple TLS certificates in a single IP address.



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- Missing Headers.
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- Special Architectures by HGs.
 - HGs acting as middleware proxies (e.g., cloudflare).







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 - Regulatory implications.
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- Hide-and-Seek.
 - Increase the bar for server identification by implementing TLS-SNI. \bullet





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- Significant fraction of user population can be served by off-nets in their ISP.
- Study of ISPs williness to host HG off-nets.
- Artifacts, datasets, and an interactive portal are available at:

https://pgigis.github.io/hypergiants-offnets/

