

# Find Topics Across Twitter for All Known State Sponsored Hackers

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# INTRODUCTION

## ISSUE

Cyber security professionals have a hard time keeping track of news regarding state sponsored hacker activities due to so many sources of information

## SOLUTION

With a list of known state sponsored hacker groups, get all relevant data from Twitter posts with hashtags of the hacker group name.

## GOAL

Discover topics for all known state sponsored hackers for which cyber security (blue team) analysts have found evidence of activity.

# METHODS

State sponsored actor  
(hacker groups) cleaned  
list from original trusted  
csv made into hashtags

The list was then used to  
get a custom json from  
from PhantomBuster that  
scraped Twitter hashtags

Standard data science  
Python libraries

PhantomBuster trial  
subscription

NMF and LDA (method 1)

Gensim's TfidfModel and  
LDA (method 2)



DATA USED

TOOLS USED

MODELS

# DATASET INFO

Number of documents  
(tweets)

**12,411**

**271,026**

Aggregated length of  
corpus

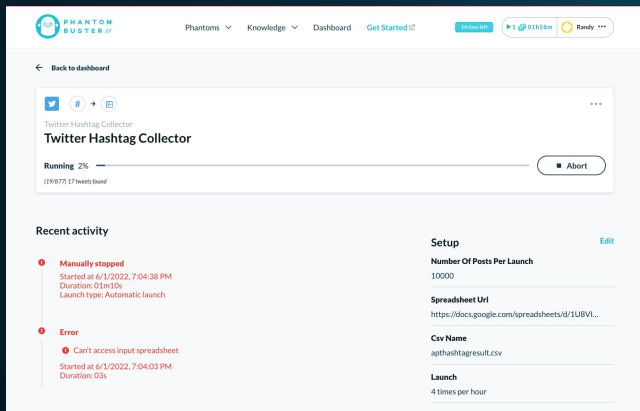
Earliest date

**2010-08-09**

**2022-06-02**

Latest date

## SAMPLE DATA



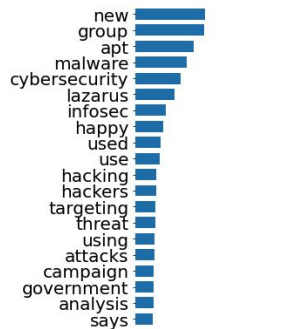
	twitterProfile	tweetUri	timestamp	query
	https://twitter.com/SpokePedal	https://twitter.com/SpokePedal/status/1531628869630951430	2022-06-02 02:01:41.260000+00:00	#Oxygen
	https://twitter.com/AlohaTemple	https://twitter.com/AlohaTemple/status/1531684233143386113	2022-06-02 01:52:28.585000+00:00	#Lazarus
https://twitter.com/shubhamwalke100	https://twitter.com/shubhamwalke100/status/1531169299984809984		2022-06-02 01:50:26.364000+00:00	#Infy
https://twitter.com/MTUArtsOffice	https://twitter.com/MTUArtsOffice/status/10493234531781265409		2022-06-02 01:45:09.982000+00:00	#Greenbug
https://twitter.com/deborah62538044	https://twitter.com/deborah62538044/status/1530269212945817600		2022-06-02 02:00:28.015000+00:00	#Nitro
https://twitter.com/MKuemmerlen	https://twitter.com/MKuemmerlen/status/10537615933585090562		2022-06-02 01:27:26.830000+00:00	#Blackfly
https://twitter.com/tur_def	https://twitter.com/tur_def/status/1531622737298526208		2022-06-02 02:12:06.548000+00:00	#SideWinder
https://twitter.com/SapphireTech	https://twitter.com/SapphireTech/status/1529100392667152386		2022-06-02 02:00:25.477000+00:00	#Nitro
https://twitter.com/CdiVilgenis	https://twitter.com/CdiVilgenis/status/855384571399024640		2022-06-02 02:07:19.553000+00:00	#RedDjinn
https://twitter.com/sunfloweruluv	https://twitter.com/sunfloweruluv/status/1530940767358836738		2022-06-02 01:27:00.728000+00:00	#BlackTech

	tweetDate	content
9985	Tue May 31 13:29:13 +0000 2022	bicyclesbeyond - #CYCOLOGY 🐞#Cycling is #oxygen for the #soul 😊Good morning dear #BikeFriends 🧑🏻‍🦱🧑🏻‍🦱🧑🏻‍🦱💚 https://t.co/pen0W72l2g
7476	Tue May 31 17:09:13 +0000 2022	#LAZARUS
6867	Mon May 30 07:03:03 +0000 2022	Booking profits early is worst than booking loss I had monthly infy calls😭#infy
5350	Mon Oct 08 15:43:15 +0000 2018	A wrap for today's film screening art(ist FILM, thanks to all who came & showed films for todays short films fest at Rory Gallagher Theatre. Image of #Greenbug by Thomas Spencer & Wilhelmina van der Bent, closing Programme 1 & more coming 2moro for Programme 2 the same venue @ 1. https://t.co/aQtHlVTzAw
9669	Fri May 27 19:26:26 +0000 2022	So thrilled on the updates of #Nitro League. I'm one of the pioneers who are observing this project's direction 🚀
1701	Sat Oct 20 21:35:16 +0000 2018	Nice #surprise! Deployed #temperature loggers as artificial substrates for #blackfly / Simuliidae #pupae in the Eulach #river https://t.co/o2ZZFzv4XK
12366	Tue May 31 13:04:51 +0000 2022	🇺🇸🇳🇱The #Netherlands to Acquire AIM-9x Block II Missiles from #USA #sidewinder https://t.co/H0TFX9ofUs
9636	Tue May 24 14:01:57 +0000 2022	Fitted with the latest Angular Velocity Fan Blade Design & constructed in the sleek white Die Casted Aluminum-Magnesium Alloy Frame, experience increased airflow & cooler operation in a strong & scratch resistant special frame with the SAPPHIRE #NITRO+ #AMD #Radeon #RX6950XT PURE https://t.co/KQIHjs73R7
11200	Fri Apr 21 11:35:48 +0000 2017	Prêt pour le #ConcertauCDI ? RV mardi prochain 25 à midi30. Dépaysement assuré, avec #RedDjinn !
1586	Sun May 29 15:54:57 +0000 2022	Check out Neon Snake Skin Print Women Deep V One Piece Swimsuit High Leg Leopard Size XL https://t.co/RpKS5TN7z6 #eBay via @eBay #PitchBlack #Blackpreneur #SupportBlackBusiness #ShopBlack #BlackTech #Blackownedbusiness #Blackexcellence #Blackgirlmagic

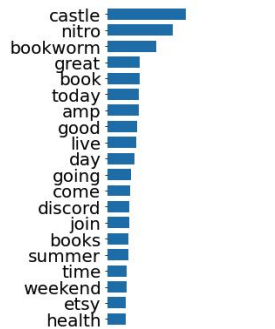


# TOPICS IN LDA MODEL

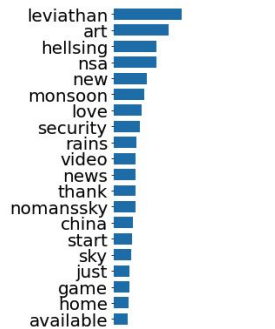
Topic 1



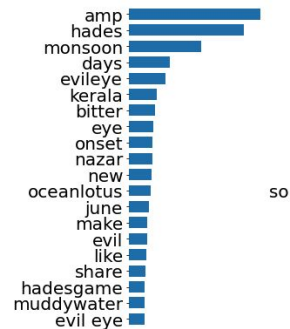
Topic 2



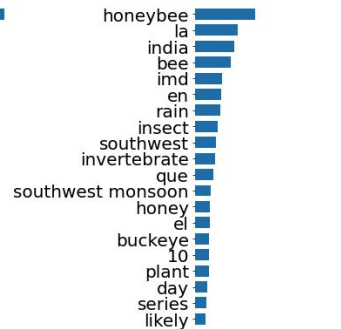
Topic 3



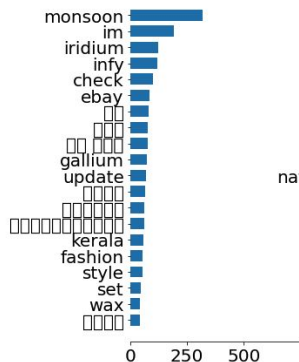
Topic 4



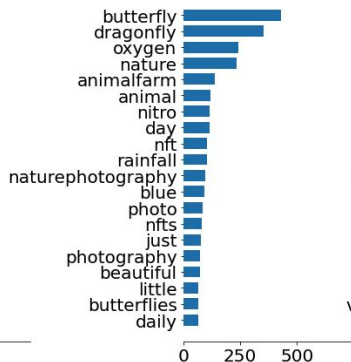
Topic 5



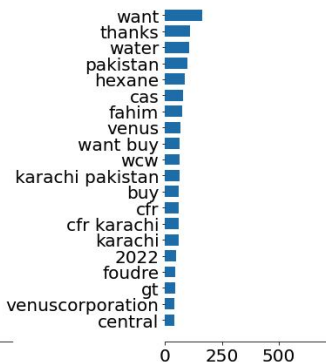
Topic 6



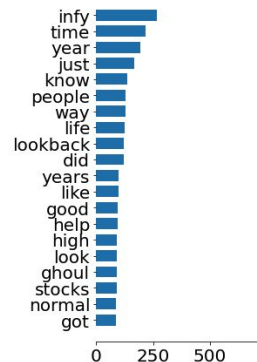
Topic 7



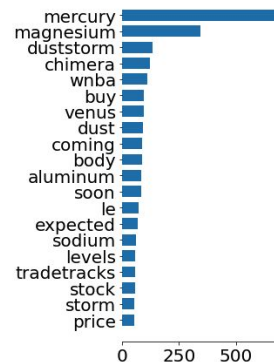
Topic 8



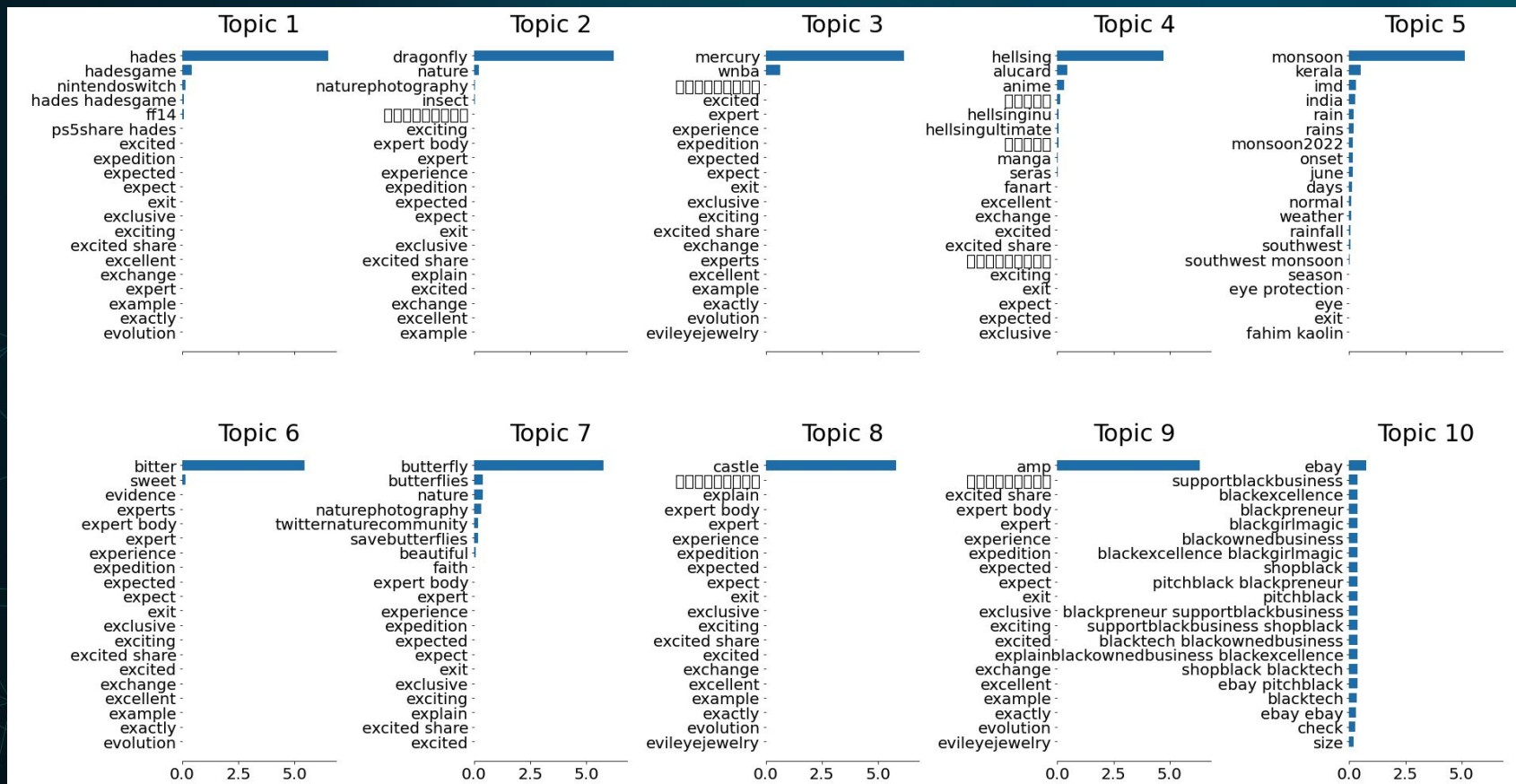
Topic 9



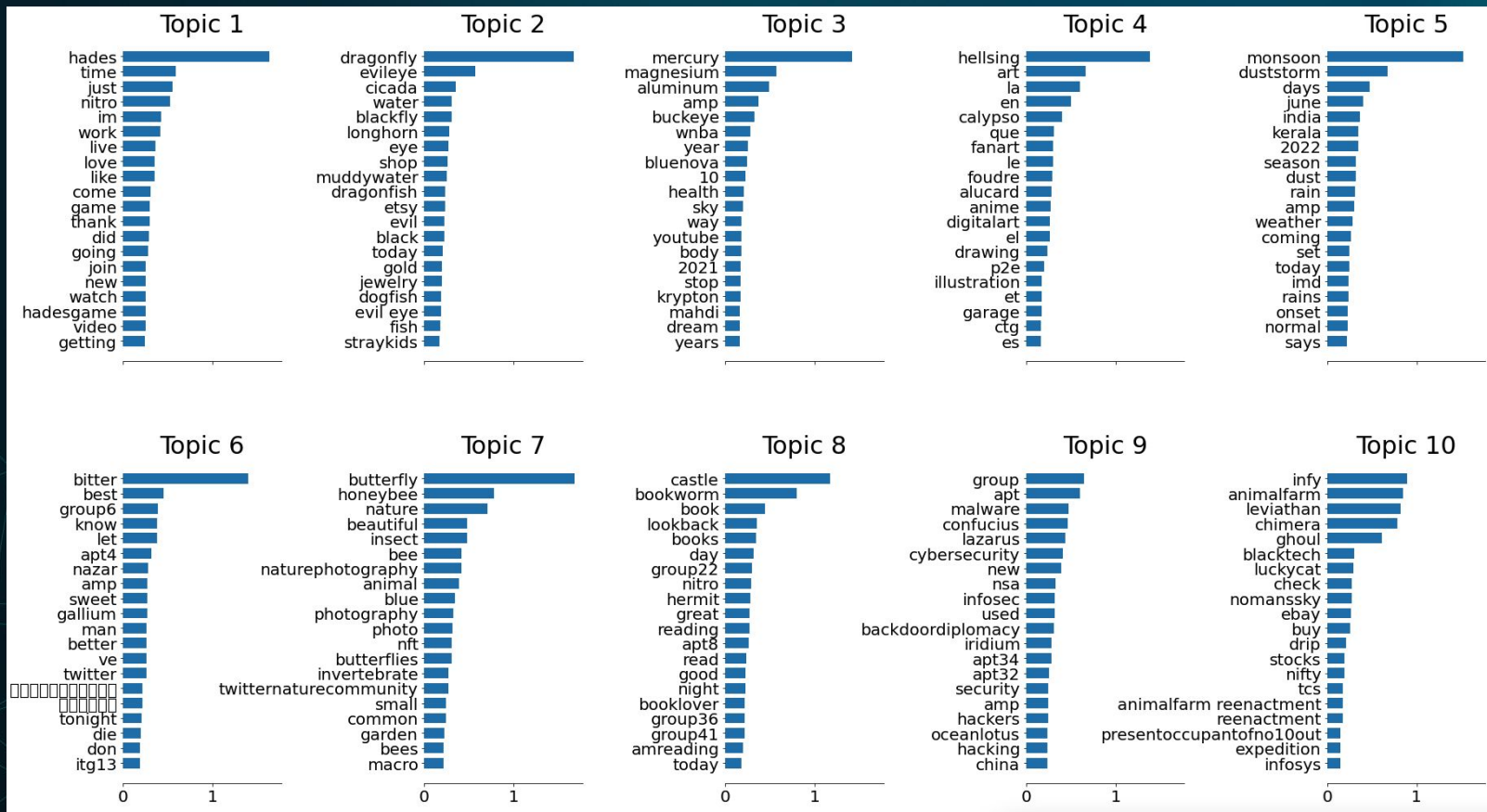
Topic 10



# TOPICS IN NMF MODEL (EUCLIDEAN DISTANCE)

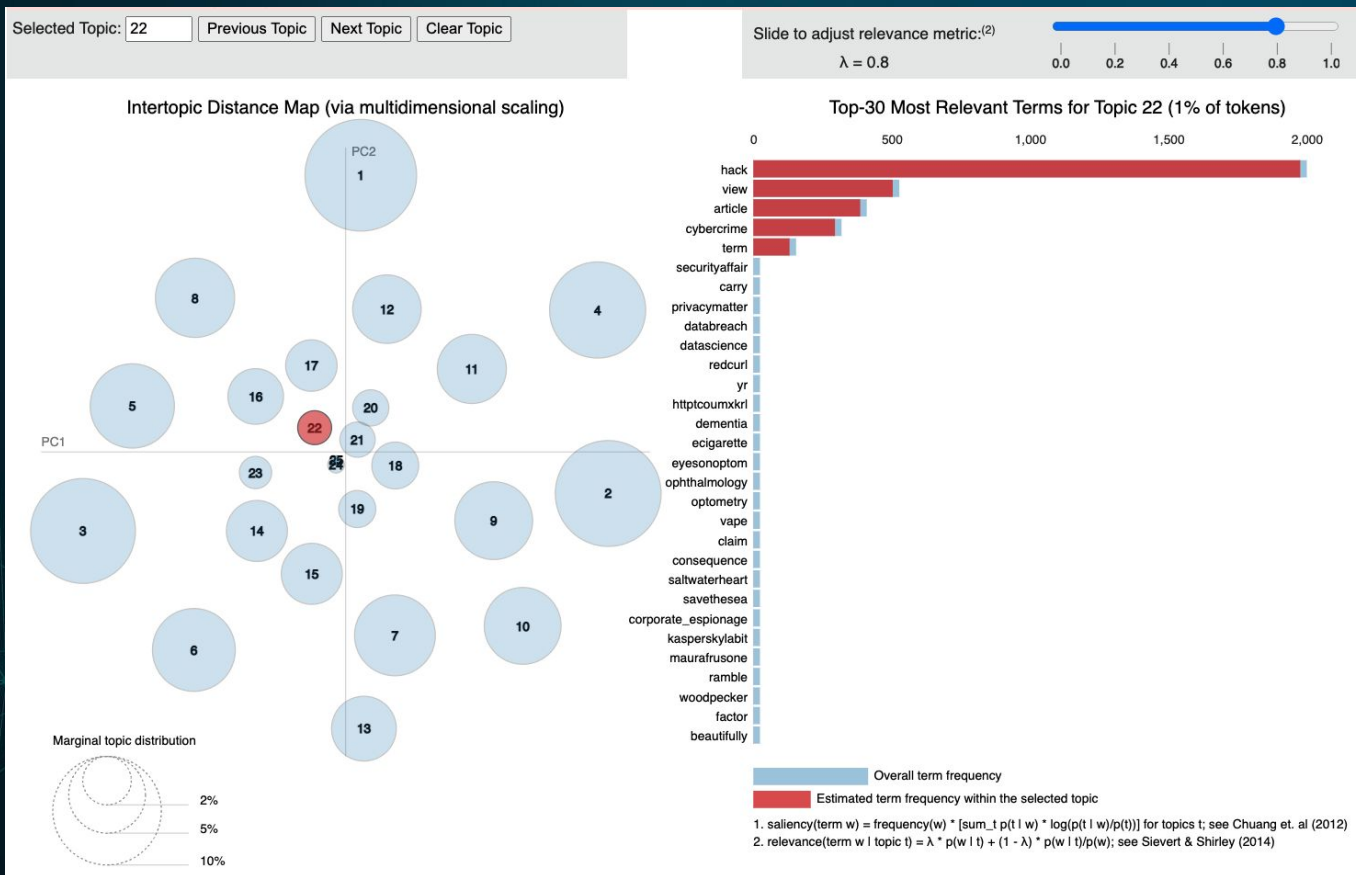


# TOPICS IN NMF MODEL (RELATIVE ENTROPY)





# TOPICS IN LDA MODEL USING GENSIM AND PYLDAVIZ



# REFERENCES

[https://scikit-learn.org/stable/auto\\_examples/applications/plot\\_topics\\_extraction\\_with\\_nmf\\_lda.html#sphx-glr-auto-examples-applications-plot-topics-extraction-with-nmf-lda-py](https://scikit-learn.org/stable/auto_examples/applications/plot_topics_extraction_with_nmf_lda.html#sphx-glr-auto-examples-applications-plot-topics-extraction-with-nmf-lda-py)

<https://www.machinelearningplus.com/nlp/topic-modeling-gensim-python/#1introduction>

<https://stackoverflow.com/questions/66759852/no-module-named-pyldavis>

<https://github.com/StrangerealIntel/EternalLiberty/blob/main/EternalLiberty.csv>

<https://phantombuster.com/>

<https://stackoverflow.com/questions/46848209/get-the-earliest-date-from-a-column-python-pandas-after-csv-reader>

<https://stackoverflow.com/a/50084009>

<https://machinelearningmastery.com/clean-text-machine-learning-python/>

<https://stackoverflow.com/questions/24386489/adding-words-to-scikit-learns-countvectorizers-stop-list/24386751#24386751>

<https://medium.com/@cmukesh8688/tf-idf-vectorizer-scikit-learn-dbc0244a911a>

[https://github.com/wjbmattnglv/topic\\_modeling\\_textbook/blob/main/03\\_03\\_lda\\_model\\_demo.ipynb](https://github.com/wjbmattnglv/topic_modeling_textbook/blob/main/03_03_lda_model_demo.ipynb)

[https://www.youtube.com/watch?v=TKjilp5\\_r7o](https://www.youtube.com/watch?v=TKjilp5_r7o)

<https://www.youtube.com/watch?v=UEn3xHNBXJU&list=PL2VXyKi-KpYttggRATQVmgFcQst3z6OIX&index=11>

# THANKS!

Questions?

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