

ON THE APPLICATION OF NLP FOR ADVANCED OSINT ANALYSIS

16th International Conference on Cyber Conflict (CyCon)

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TARANIS_AI

<https://taranis.ai/>

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WHAT IS CYBER SECURITY OSINT?

- Open-source intelligence (OSINT) is the collection and analysis of data gathered from open sources to produce actionable intelligence.
- Technical Cyber Threat Intelligence (CTI) to configure detection systems:
 - Indicators to put into SIEMs
 - Domains to block in name-servers or proxies
 - Execution patterns to block in EDRs
- But also “soft” CTI:
 - News about threat actors
 - New (features of) security products
 - News about breaches, incidents, campaigns
 - News about vulnerabilities, patches, mitigations, counter-measures, exploitation, post-exploitation, ...
 - Policy news: political/diplomatic initiatives, new EU policy documents, GDPR-related lawsuits
 - Updates on security standards (ISO, BSI, ANSI, CIS, OWASP, ...)
 - Mergers, acquisitions, failures, ... or other company news

Baseline today of one of our national stakeholders: approx 250 sources, up to 500 articles per day, more after longer weekends or large-scale events

WHAT IS OSINT GOOD FOR?

- Gather public information on potential security threats, vulnerabilities, trends, attacker TTPs, new risks etc. to maintain situational awareness and take early counter actions.
- Input for products
 - Advisories
 - Summaries (daily, weekly)
 - Situational reports, white papers, fact-sheets
- Awareness / Preparedness
 - Consulting / Answering calls for help
 - Media inquiries
 - “Boss/CEO/Politician asking questions”
 - Trigger for proactive activities
- Challenge: Number of OSINT sources is high and the number of news items massive
 - Grasp quickly what’s relevant and omit the rest
 - Filter repetitive content
 - The workflow is actually pretty similar to a journalists work

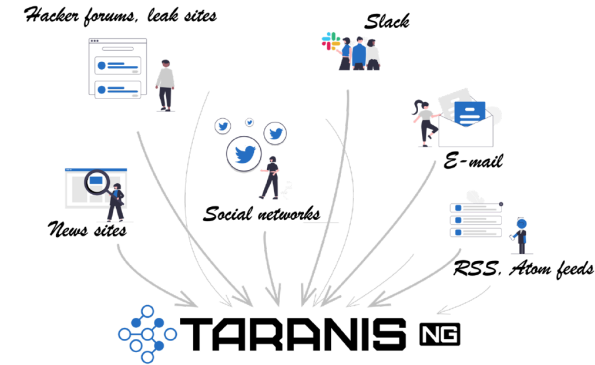


TARANIS AI

- Based on *taranis3** and *taranis-ng***
 - Great tools to ingest raw unstructured data from various sources
 - Use human knowledge to identify relevant information
- Preserves the “taranis workflow” many CERTs are used to
 - Gather -> Assess -> Analyze -> Publish
- Introduces natural language processing (NLP) capabilities
 - Extraction of relevant **named entities**
 - **Clustering** of related **news items**
 - **Summaries** of “story clusters”
 - **Recommendations** of news items
 - Support for **creating OSINT products** (“reports”)

* <https://github.com/NCSC-NL/taranis3>

** <https://github.com/SK-CERT/Taranis-NG>



APPLYING THE POWER OF NLP



User Story 1: *What are the 'hot topics' of the last 24 hours?*




User Story 2: *What do we know about a specific entity? (e.g., a vulnerability, malware, company, product, person, location etc.)*



User Story 3: *How can I find more related news items after reading this interesting article?*



User Story 4: *Which news items are pertinent to my mission?*



User Story 5: *How can I efficiently sum up my findings for my commander or operators of military IT services?*

NOVEL FEATURES AND DEVELOPMENTS

The screenshot displays the TARANIS AI interface with search results for the query "rs Accidentally Expose". The interface includes a sidebar with filters and a main content area with article cards. Callouts highlight specific features:

- Summary Creation:** Points to the top-left sidebar area.
- NER (Named Entity Recognition):** Points to the top-right article card, which shows tags like "APIs", "Richard Bird", "Richard", "CNBC", "Center", "CVE-2023-3467", "CVE-2023-3466", "Facebook", "Firefox", "Firefox ESR", "CVE-2023-42857", "CVE-2023-40044", "Mastodon", "Apple", "Cisco", "Company", "Controls", "Mitsubishi Electric", and "Sony".
- Relevance Ranking:** Points to the middle article card, which shows a "Relevance: 11" score.
- Story Clustering:** Points to the bottom article card, which shows a "Relevance: 11" score.

FEATURES (1/5): NAMED ENTITY RECOGNITION

- Named-entity recognition (NER) seeks to locate and classify named entities mentioned in unstructured text into pre-defined categories such as person names, organizations, locations, etc.
- Mix of pre-defined lists (e.g., countries), custom regex (e.g., CVEs), and trained language model on German/English standard text
- Custom extensions to recognize IT products, vendors, APT groups etc.
- *Future Extension:*
 - Additional use of domain-specific word lists

open | add to report | collapse [4] | read | ⋮

Published: September 17, 2023 - September 20, 2023

Tags: Liechtenstein, Schweiz, Österreich, DoppelPaymer, Ukraine, Deutschland, Vaduz, Franz Ruf, fedpol, Nicoletta della V..., Jules Hoch, Sabine Monauni, Ruf, LKA, Süddeutschland, Igor Garshin, Europol, FBI, Parker, Garshin

Relevance: 3

open | add to report | collapse [2] | read | ⋮

Published: September 15, 2023 ⚠

Tags: Volt Typhoon, PDF, Microsoft, China, Russia, Taiwan, Ukraine, FortiOS, FortiProxy, FortiWeb, Fortinet, CVE-2023-29183, CVE-2023-34984

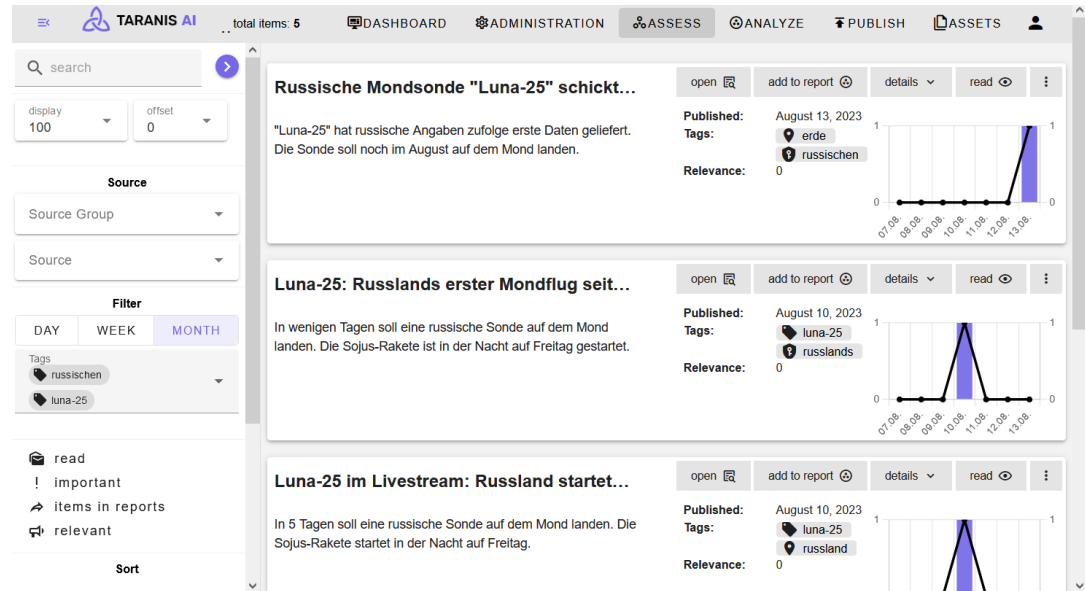
Relevance: 1

DoD: China's ICS Cyber Onslaught Aimed at Gaining Kinetic Warfare Advantage

Escalating incursions into military base infrastructure, telecom networks, utilities, and more signal that Beijing is laying the groundwork for mass disruption.

FEATURES (2/5): ADVANCED SEARCH & FILTERING

- Tags from NER can be used to filter and cluster items belonging to the same topic
- Additional free-text search
- Further filter and sort parameters
 - read/unread, relevance score etc.
 - Sources and source groups
 - Time spans
- *Future extension:*
 - Collaborative search and filtering
 - Sharing of filters

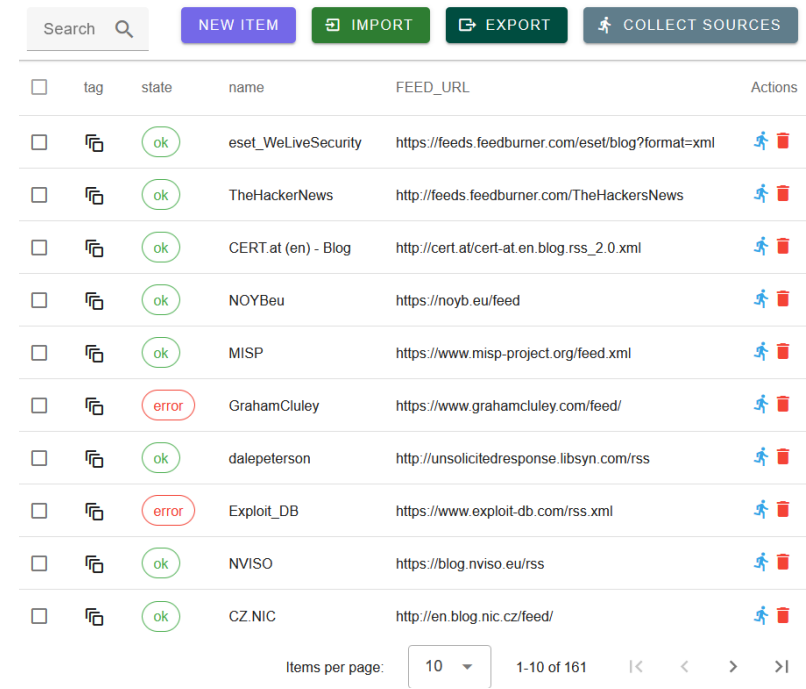


The screenshot displays the TARANIS AI interface with the following components:

- Navigation Bar:** Includes icons for home, search, and navigation, along with menu items: DASHBOARD, ADMINISTRATION, ASSESS, ANALYZE, PUBLISH, and ASSETS.
- Search Bar:** A search input field with a magnifying glass icon and a blue search button.
- Display Settings:** A dropdown for 'display' set to '100' and an 'offset' set to '0'.
- Source Filter:** A 'Source' dropdown menu currently set to 'Source Group'.
- Filter Panel:**
 - Filter Type:** Radio buttons for DAY, WEEK, and MONTH (selected).
 - Tags:** A list of tags including 'russischen' and 'luna-25'.
 - Actions:** A 'read' button, an 'important' icon, 'items in reports', and a 'relevant' icon.
 - Sort:** A section for sorting options.
- Search Results:** Three items are shown, each with a title, description, and a relevance graph.
 - Item 1:** "Russische Mondsonde 'Luna-25' schickt...". Published: August 13, 2023. Tags: 'erde', 'russischen'. The graph shows a sharp increase in relevance starting on 13.08.
 - Item 2:** "Luna-25: Russlands erster Mondflug seit...". Published: August 10, 2023. Tags: 'luna-25', 'russlands'. The graph shows a peak in relevance on 10.08.
 - Item 3:** "Luna-25 im Livestream: Russland startet...". Published: August 10, 2023. Tags: 'luna-25', 'russland'. The graph shows a peak in relevance on 10.08.

FEATURES (3/5): RELEVANCE RANKING

- Relevance Ranking helps to identify “interesting items” (aka stories) based on general importance and personal preferences
 - Upvotes and downvotes from collaborators
 - Shared articles
 - Related news items
- *Future Extensions:*
 - Feedback Loop: Learn properties of often up-/downvotes items.
 - What properties do “good” articles have in common?
 - Which sources deliver such items?

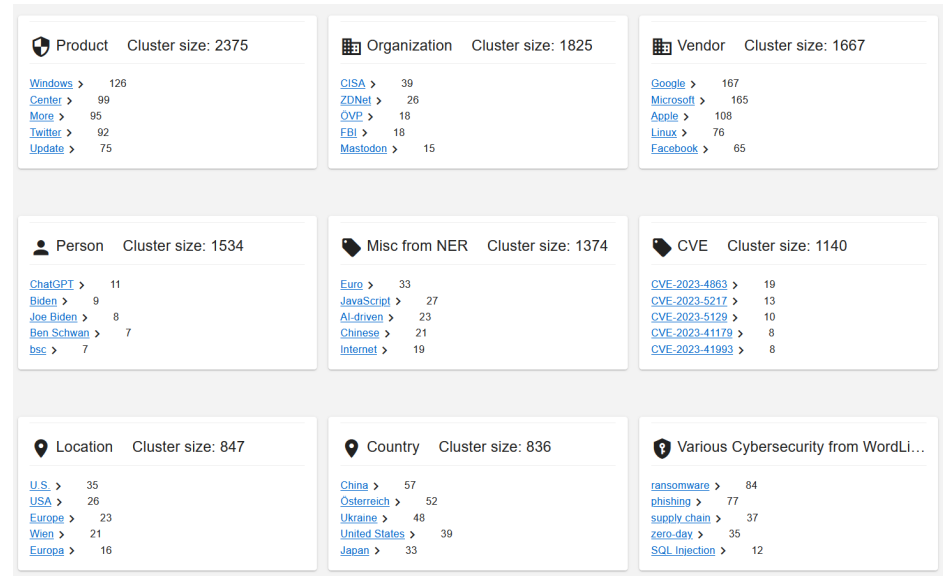


<input type="checkbox"/>	tag	state	name	FEED_URL	Actions
<input type="checkbox"/>		ok	eset_WeLiveSecurity	https://feeds.feedburner.com/eset/blog?format=xml	
<input type="checkbox"/>		ok	TheHackerNews	http://feeds.feedburner.com/TheHackersNews	
<input type="checkbox"/>		ok	CERT.at (en) - Blog	http://cert.at/cert-at.en.blog.rss_2.0.xml	
<input type="checkbox"/>		ok	NOYBeu	https://noyb.eu/feed	
<input type="checkbox"/>		ok	MISP	https://www.misp-project.org/feed.xml	
<input type="checkbox"/>		error	GrahamCluley	https://www.grahamcluley.com/feed/	
<input type="checkbox"/>		ok	dalepeterston	http://unsolicitedresponse.libsyn.com/rss	
<input type="checkbox"/>		error	Exploit_DB	https://www.exploit-db.com/rss.xml	
<input type="checkbox"/>		ok	NVISO	https://blog.nviso.eu/rss	
<input type="checkbox"/>		ok	CZ.NIC	http://en.blog.nic.cz/feed/	

Items per page: 1-10 of 161 << >>

FEATURES (4/5): SUMMARY & REPORT CREATION

- Summaries help to condense lengthy texts to their essential parts for quick decisions on their relevance
 - Summary of lengthy news items to quickly grasp its content
 - Summary of stories based on its collection of articles
- *Future Extensions*
 - Summary of Sharing Sets for reports
 - AI-assisted Pre-filling of report fields
 - Tuning of summaries regarding appropriate length, wording and content



The screenshot displays a grid of report cards, each representing a different cluster of data. Each card includes an icon, a title, a cluster size, and a list of items with their respective counts.

Cluster Title	Cluster Size	Items
Product	2375	Windows > 126, Center > 99, More > 95, Twitter > 92, Update > 75
Organization	1825	CISA > 39, ZDNet > 26, ÖVP > 18, FBI > 18, Mastodon > 15
Vendor	1667	Google > 167, Microsoft > 165, Apple > 108, Linux > 76, Facebook > 65
Person	1534	ChatGPT > 11, Biden > 9, Joe Biden > 8, Ben Schwan > 7, bsc > 7
Misc from NER	1374	Euro > 33, JavaScript > 27, AI-driven > 23, Chinese > 21, Internet > 19
CVE	1140	CVE-2023-4863 > 19, CVE-2023-5217 > 13, CVE-2023-5129 > 10, CVE-2023-41179 > 8, CVE-2023-41993 > 8
Location	847	U.S. > 35, USA > 26, Europe > 23, Wien > 21, Europa > 16
Country	836	China > 57, Österreich > 52, Ukraine > 48, United States > 39, Japan > 33
Various Cybersecurity from WordLI...		ransomware > 84, phishing > 77, supply chain > 37, zero-day > 35, SQL Injection > 12

FEATURES (5/5): TOPIC & STORY CLUSTERING

- News Items are usually delivered not just by one, but multiple sources at approximately the same time with mostly similar content
- Cluster items and create “meta item” that summarizes important content (“story”)
 - Decrease human effort needed to ingest all news items!
 - Visualize development of a story over time
- Show development of “hot topics” over time

Signal Messenger Introduces PQXDH Quantum-Resistant Encryption

Encrypted messaging app Signal has announced an update to the Signal Protocol to add support for quantum resistance by upgrading the Extended Triple Diffie-Hellman (X3DH) specification to Post-Quantum Extended Diffie-Hellman (PQXDH). "With this upgrade, we are adding a layer of protection against the threat of a quantum computer being built in the future that is powerful enough to break current

Published: September 14, 2023 - September 20, 2023

Tags: Azure, Google, IBM, Infrastructure, Intel, Microsoft, RSA, transmission, supply chain, NIST, PQC, Internet, Windows NT, SSL, TLS1.3, Cryptocurrencies, Microsoft Active..., SHA-2, SaaS, DHS

Relevance: 3

Getting ready for a post-quantum world

Quantum computers are changing the cryptography rules Under Data Encryption, the CISA Zero Trust Maturity Model v2.0 cites the criticality of "cryptographic agility" on the third (out of four) level of maturity. Cryptographic agility is the ability to change the underlying cryptographic algorithms in applications and...

Published: Sep 14, 2023, 10:00
Source: cybersecurity.att.com
Author:

Signal adds quantum-resistant encryption to its...

Signal adds quantum-resistant encryption to its E2EE messaging protocol Bill Toulas - September 20, 2023 - 09:29 AM - 0 Signal has announced that it upgraded its end-to-end communication protocol to use quantum-resistant encryption keys to protect users from future attacks. Quantum computers that us...

Published: Sep 20, 2023, 09:29
Source: bleepingcomputer.com
Author: Bill Toulas

The Signal Protocol used by 1+ billion people is...

The Signal Foundation, maker of the Signal Protocol that encrypts messages sent by more than a billion people, has rolled out an update designed to prepare for a very real prospect that's never far from the thoughts of just about every security engineer on the planet: the catastrophic fall of cryptographic protocols that secur...

Published: Sep 20, 2023, 13:59
Source: feeds.arstechnica.com
Author: Dan Goodin

Signal Messenger Introduces PQXDH Quantum-...

Encrypted messaging app Signal has announced an update to the Signal Protocol to add support for quantum resistance by upgrading the Extended Triple Diffie-Hellman (X3DH) specification to Post-Quantum Extended Diffie-Hellman (PQXDH). "With this upgrade, we are adding a layer of protection against the...

Published: Sep 20, 2023, 14:59
Source: feeds.feedburner.com
Author: info@thehackernews.com (The Hacker News)

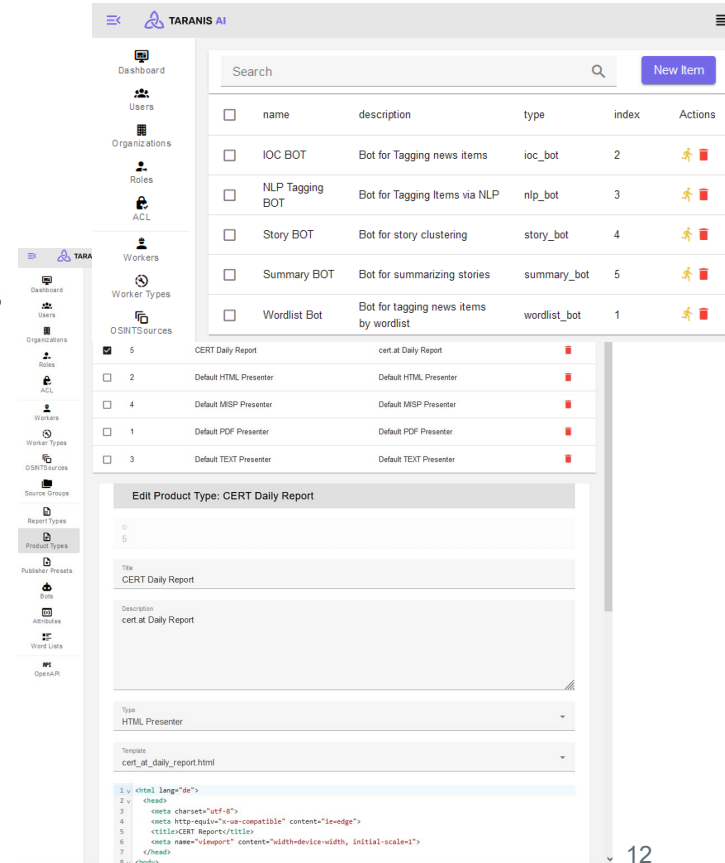
TECHNOLOGY

- Gathering from a **multitude of OSINT sources** via RSS, from the Web, e-Mail, and some APIs for common issue tracker
- **Asynchronous Pub-Sub architecture** with workers for flexible extensibility in terms of AI and NLP
 - Workers process items “best effort” in predefined order, e.g., extract IoCs, NER, storyclustering, summary creation etc.
- Resulting **products are text file, pdf, html** and pushed out via Mail, or to a **MISP** Server via API
- **100% open source** and free to use (EUPL license)
 - Please contribute! (issues, pull request, ...)

29/05/2024



 C E L E R Y

The screenshot shows the TARANIS AI web interface. On the left is a navigation sidebar with icons for Dashboard, Users, Organizations, Roles, ACL, Workers, Worker Types, OSINT Sources, Source Groups, Report Types, Product Types, Publisher Presents, Files, Advisories, Word Lists, and OpenAPI. The main content area features a search bar and a 'New Item' button. Below is a table of bots:

<input type="checkbox"/>	name	description	type	index	Actions
<input type="checkbox"/>	IOC BOT	Bot for Tagging news items	ioc_bot	2	
<input type="checkbox"/>	NLP Tagging BOT	Bot for Tagging Items via NLP	nlp_bot	3	
<input type="checkbox"/>	Story BOT	Bot for story clustering	story_bot	4	
<input type="checkbox"/>	Summary BOT	Bot for summarizing stories	summary_bot	5	
<input type="checkbox"/>	Wordlist Bot	Bot for tagging news items by wordlist	wordlist_bot	1	

Below the table, a 'CERT Daily Report' product is shown in a detailed view. It includes fields for Title, Description, Type (HTML Presenter), and Template (cert_at_daily_report.html). At the bottom, a code editor displays the HTML template:

```

1 <html lang="de">
2 <head>
3   <meta charset="utf-8">
4   <meta http-equiv="x-ua-compatible" content="ie=edge">
5   <title>CERT Reports</title>
6   <meta name="viewport" content="width=device-width, initial-scale=1">
7 </head>
8 </html>
  
```

LESSONS LEARNED FROM FIRST PILOTS

The need for **high-quality gathering**

- „Garbage in – garbage out“
- Daily digests
- **Polluting texts** (menus, footers...)
- **Various formats**, changing layouts
- RSS v.s. HTML (in terms of tables, figures, etc.)
- **Near duplicates** & updated articles

The need for **adaptable and flexible workflows**

- Potentially **complex workflows** across different roles/departments
- **flexible use cases**
- „generic“ features, most important
- **„flags“** (has been read, analyzed, reported, escalated, ...)
- Preserve the „taranis workflow“, but be adaptable to different organizational structures

The need for **manually corrected AI-produced results**

- AI can tremendously relieve human analysts from tiring tasks
- But **human element remains indispensable**
- Correction of AI-produced results is valuable **feedback to tune algorithms** (revising tags, removing items from story, splitting cluster...)
- Enhances the effectiveness of AI

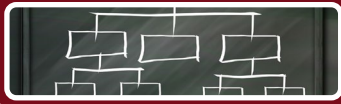
The need for carefully **tuned recommender systems**

- Even with regular feedback through humans, **learned models remain intransparent**
- Importance of **explainability** – why was an item categorized in a certain way?
- Detect and **mitigate biases and concept drifts**
- **Re-evaluation of past decisions** is tricky (e.g., dismiss this story for good)

SCIENTIFIC CHALLENGES & NEW FEATURES AHEAD



improve **self-asset management** for alignment and matching of findings to own assets (prioritize/rank news items)



Taking further **context** into account, e.g., mission-specific information, to **provide targeted and easy to comprehend CTI** for efficient & informed decision making in tense and stressful situations



use of **LLMs to formulate situational awareness reports** for specific stakeholders in their own language, e.g. present information about vulnerabilities, major incidents, new risks for specific roles



automatic **notification of emerging threats**, e.g., because of dynamic growth of a story on a specific topic, **sentiment analysis** of social media posts that mention entities in a certain context



improve the **handling of classified information**, e.g., stories from OSINT that are being enriched with closed source information can only be partially disseminated and via pre-defined channels



improve **sharing capabilities** across instances of taranis-AI (currently analysts work all on one instance), standardized interfaces to common solutions in the domain, e.g., MISP

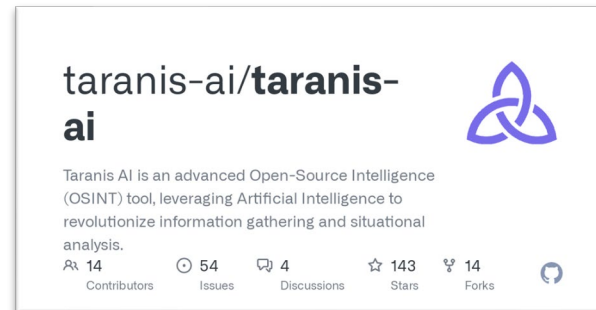
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- Active collaboration with CERT.at, Austrian Ministry of Interior and Austrian MoD
 - Early adoption of taranis-ai by analysts
- Exchange with SK CERT, the developers of taranis-ng
- Open Source project on Github
 - Opportunity to contribute: <https://taranis.ai/>



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TARANIS_AI

<https://taranis.ai/>

AIT
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TOMORROW TODAY

THANK YOU!

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