

# Beyond CVEs: Mastering the Landscape with **Vulnerability-Lookup**

from CVE to CVD

★ https://www.vulnerability-lookup.org

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CIRCL https://www.circl.lu





# Origin of the project

### Who is behind Vulnerability-Lookup?



Vulnerability-Lookup<sup>1</sup> is an Open Source project led by **CIRCL**. It is co-funded by **CIRCL** and the **European Union**<sup>2</sup>. Used by many organisations including CSIRTs and ENISA (EUVD). A reference implementation to **GCVE** standards.



<sup>1</sup> https://www.vulnerability-lookup.org

https://github.com/ngsoti

### Origin

- cve-search<sup>3</sup> is an open-source tool initially developed in late 2012, focusing on maintaining a **local** CVE database.
- cve-search is widely used as an internal tool.
- The design and scalability of cve-search are limited. Our operational public instance at https://cve.circl.lu has reached a hard limit of 20,000 queries per second.
- Vulnerability sources have diversified, and the NVD CVE is no longer the sole source
  of vulnerability information.

<sup>3</sup>https://github.com/cve-search/cve-search

### **Initial Challenges**

- **Volume of data:** Handling a substantial dataset and heavy network traffic, currently over 1,360,500 security advisories and more than 90,000 sightings<sup>4</sup>.
- Flexibility: Balancing ongoing development with legacy issues while designing a future-proof architecture. It's complex and yes, sometimes chaotic<sup>5</sup>.
- Robustness: Validating data even when external entities don't comply with their own JSON schemas. It's not always pretty.
- Fast lookup: Rapidly correlating identifiers across diverse sources, including unpublished advisories.

<sup>&</sup>lt;sup>4</sup>The first sighting on Exploit-DB dates back 26 years.

<sup>&</sup>lt;sup>5</sup>We enjoy challenges, especially when they lead to practical solutions.

### **Ongoing Challenges and Development**

- **CPE fragmentation:** Tackling the fragmentation of CPEs (e.g., cpe:/a:oracle:java vs. cpe:/a:sun:java) by introducing *Organizations* as unified containers.
- CVD process: Building an open-source tool that fully supports the Coordinated Vulnerability Disclosure (CVD) process.<sup>7</sup>
- Vulnerability numbering: Enabling a new distributed approach through the Global CVE Allocation System.<sup>8</sup>
- **Scoring vulnerabilities:** Aggregating a large volume of observations from diverse advisory types to improve vulnerability scoring.

<sup>&</sup>lt;sup>6</sup>Well, another mess to clean up!

<sup>&</sup>lt;sup>7</sup>Aligned with NIS 2 and the Cyber Resilience Act.

<sup>8</sup>https://gcve.eu

### Current Sources in Vulnerability-Lookup

- CISA Known Exploited Vulnerability (HTTP)
- NIST NVD CVE (API 2.0)
- CVEProject cvelist (Git submodule)
- Fraunhofer FKIE (Git submodule)
- Cloud Security Alliance GSD (Git submodule)
- GitHub Advisory DB (Git submodule)
- PySec Advisory DB (Git submodule)

- CSAF 2.0 (HTTP CSAF)
  - CERT-Bund, Cisco, Siemens, Red Hat, Microsoft, NCSC-NL, CISA, etc.
- VARIoT (API)
- Japan JVN DB (HTTP)
- Tailscale (RSS)
- GCVE.eu all GNA sources
- CWE, CAPEC, MITRE EMB3D or KEV
- Growing...

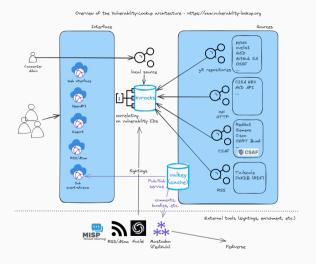
**Open Data Initiative:** Regular JSON dumps published<sup>9</sup>.

9https://vulnerability.circl.lu/dumps/



# Design and Implementation

### Vulnerability-Lookup High-Level Architecture



#### **Extended API**

```
$ curl -s https://vulnerability.circl.lu/api/vulnerability/last/csaf_redhat/10 | jq .[2].document.title
"Red Hat Security Advisory: Red Hat Ceph Storage 6.1 security and bug fix update"

$ curl -s https://vulnerability.circl.lu/api/vulnerability/last/csaf_redhat/10 | jq .[2].vulnerabilities[0].cve
"CVE-2021-4231"
```

- **Documented API** (OpenAPI): https://vulnerability.circl.lu/api
- Pagination and filtering by source
- CPE search by vendor and product name
- Many endpoints available via RSS and Atom<sup>10</sup>

 $<sup>^{10} {\</sup>tt https://www.vulnerability-lookup.org/documentation/feeds.html}$ 

# **Empowering the Community**

### **Crowd-Sourced Threat Intelligence**

- Bundles: Group similar vulnerabilities and aggregate sightings for easier tracking.
- Comments: Additional context such as PoCs, remediations, related insights.
- Tags: Use the MISP Vulnerability Taxonomy to annotate comments<sup>11</sup>. Example:

vulnerability:information=remediation

• **Sightings:** Report real-world observations of vulnerabilities, including metadata like timestamps and sources.

```
"uuid": "f9ec8b2c-2ceb-4c05-b052-264b51c6a3ee", "vulnerability_lookup_origin": "1a89b78e-f703-45f3-bb86-59eb712668bd",
"author": "9f56dd64-161d-43a6-b9c3-555944290a09", "creation_timestamp": "2025-04-17T19:14:32.000000Z",
"vulnerability": "CVE-2025-32433",
"type": "exploited",
"source": "https://gist.github.com/numanturle/b7333fb02a4ee3618995babc9b62c507"
```

<sup>11</sup>https://www.misp-project.org/taxonomies.html#\_vulnerability\_3

## **Types of Sightings**

| Туре      | Description  | Negative/Opposite |
|-----------|--|-------------------|
| seen      | The vulnerability was mentioned, discussed, or ob- | -                 |
|           | served by the user.                                |                   |
| confirmed | The vulnerability has been verified by an analyst. | X                 |
| exploited | The vulnerability was actively exploited and ob-   | X                 |
|           | served by the user reporting the sighting.         |                   |
| patched   | The vulnerability was successfully mitigated or    | X                 |
|           | patched by the user reporting the sighting.        |                   |

Table 1: Types of vulnerability sightings

### **Automated Sightings: Tools and Sources**

Automatically gathering crowd-sourced intelligence without requiring direct user contributions to our platform.

- Social Platforms: Fediverse, Bluesky
- Threat Intelligence Tools: MISP, Nuclei
- Content Feeds: RSS/Atom, curated web pages, GitHub Gist
- Specialized Projects: ShadowSight, ExploitDBSighting
- Community Contributions: Passive signals and indirect data enrichment

# Scoring Vulnerabilities

### Sightings Detection Rate and Types of Sightings

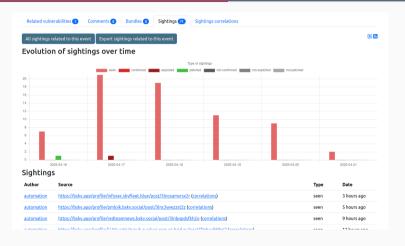
- A high rate of sightings (type *seen*) often correlates with high or critical severity vulnerabilities<sup>12</sup>.
- Early sightings of type exploited (e.g., proof-of-concept code) or confirmed (e.g., detection templates for tools like Nuclei) can signal emerging threats.
- Sightings can sometimes be detected before any official advisory is published.



 Continuous exploitation patterns are frequently observed through sources like The Shadowserver Foundation or MISP.

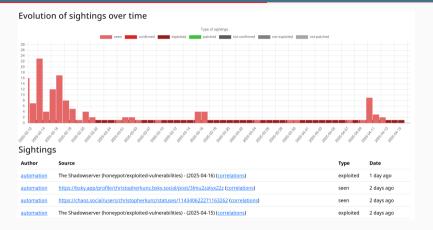
 $<sup>^{12}</sup>$ Don't underestimate the hype surrounding some vulnerabilities.

### Early PoC (erlang / otp)



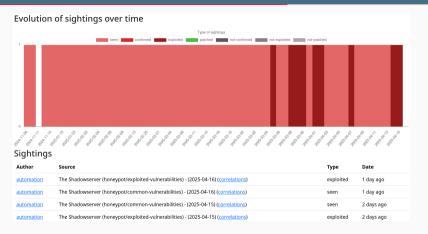
https://vulnerability.circl.lu/vuln/CVE-2025-32433#sightings

### Continuous Exploitations (Palo Alto Networks / Cloud NGFW)



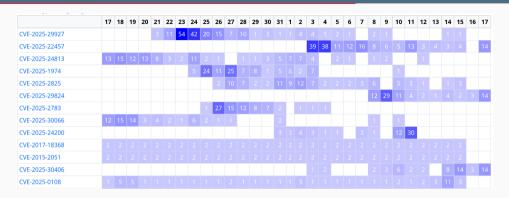
https://vulnerability.circl.lu/vuln/CVE-2025-0108#sightings

### Continuous Exploitations (D-Link / DNS-320)



https://vulnerability.circl.lu/vuln/CVE-2024-10914#sightings

### Last Month's Most Sighted Vulnerabilities



- CVE-2025-22457: Ivanti / Connect Secure Severity: 10.0 (Critical)
- CVE-2025-29927: Vercel / Next.js Severity: 9.1 (Critical)

### **Other Examples**

| Vulnerability  | Product        | Sighting count | EPSS             | Severity |
|----------------|----------------|----------------|------------------|----------|
| CVE-2025-29927 | next.js        | 167            | 89.24% (0.99521) | 9.1      |
| CVE-2025-24813 | Apache Tomcat  | 128            | 93.55% (0.99827) | 9.2      |
| CVE-2024-4577  | PHP            | 190            | 94.38% (0.99961) | 9.8      |
| CVE-2025-0282  | Connect Secure | 243            | 90.87% (0.99618) | 9.0      |
| CVE-2024-55591 | FortiOS        | 126            | 92.79% (0.99756) | 9.8      |
| CVE-2024-10914 | D-Link DNS-320 | 81             | 93.73% (0.9985)  | 9.2      |
| CVE-2020-21650 | Myucms         | 57             | 2.48% (0.83998)  | 9.1      |

Table 2: Top vulnerabilities from our April 2025 report, based on sightings and scoring data.

### **Least Sighted Vulnerabilities in the Last Month**



- Low-sighting outliers offer valuable intel, even if absent from EPSS or predictive models.
- Particularly relevant in low-noise sources (e.g., MISP, private Telegram channels).
- Often rated low/medium by CVSS and have low EPSS scores.
- Trend highlights EPSS's dependence on public threat intel feeds.

### Tracking the Exploitability of Vulnerabilities Prior to Public Disclosure

- Google / Android: https://vulnerability.circl.lu/vuln/CVE-2024-43093#sightings
- Speedify VPN (macOS): https://vulnerability.circl.lu/vuln/CVE-2025-25364#sightings
- **SourceCodester:** https://vulnerability.circl.lu/vuln/CVE-2025-3821#sightings
  - Low visibility, no EPSS score, few sightings



**Toward Practical AI Applications** 

## From Data to Datasets

#### **Contents**

- 1. Origin of the project
- 2. Design and Implementation

- Empowering the Community
- 4. Scoring Vulnerabilities

### Why We Share Datasets

- Open Data Initiative: CIRCL's commitment to making data openly available.
- Consistent open approach applied across all our projects.
- Regularly updated JSON dumps <sup>13</sup> and "AI" datasets <sup>14</sup>.
- Public, unauthenticated API access for Vulnerability-Lookup.

<sup>13</sup> https://vulnerability.circl.lu/dumps/

<sup>14</sup>https://huggingface.co/CIRCL/datasets

### The Messy Reality of Large Datasets

- Our experience with large datasets is not recent (Passive DNS<sup>15</sup>, BGP ranking<sup>16</sup>, MISP<sup>17</sup>, AIL<sup>18</sup>, Lookyloo<sup>19</sup>, etc.). And we learned from our past mistakes.
- Adapt to real-world conditions avoid creating yet another format or standard.
- Deal with missing data, malformed JSON, and conflicting information.
- Tolerate unreliable or unstable remote servers (e.g., some CSAF providers).

<sup>15</sup>https://www.circl.lu/services/passive-dns/

<sup>16</sup> https://github.com/D4-project/BGP-Ranking

<sup>17</sup>https://github.com/MISP

<sup>18</sup> https://github.com/ail-project

<sup>19</sup> https://github.com/Lookyloo

### **Building AI Datasets**

- Turn messy data into structured, actionable insights.
- Link related vulnerabilities via enrichment, correlation, and crawling.
- Support the process with **VulnTrain**<sup>20</sup>.

<sup>20</sup> https://github.com/vulnerability-lookup/VulnTrain

#### **Current datasets**

| Dataset                               | Size (rows) | Generation Time | Features                       |
|---------------------------------------|-------------|-----------------|--------------------------------|
| vulnerability-scores <sup>21</sup>    | 641,547     | 10m45s          | Descriptions (en), CVSS, CPE   |
| vulnerability-CNVD <sup>22</sup>      | 122,546     | 1m31s           | Descriptions (cn), CVSS        |
| vulnerability-cwe-patch <sup>23</sup> | 883         | 210m            | Descriptions (en), CWE,        |
|                                       |             |                 | patches (commit id $+$ url $+$ |
|                                       |             |                 | full diff)                     |

<sup>&</sup>lt;sup>21</sup>https://huggingface.co/datasets/CIRCL/vulnerability-scores

<sup>22</sup>https://huggingface.co/datasets/CIRCL/Vulnerability-CNVD

<sup>23</sup>https://huggingface.co/datasets/CIRCL/vulnerability-cwe-patch

### From Datasets to Models

#### **Contents**

- 1. Origin of the projec
- 2. Design and Implementation

- 3. Empowering the Community
- 4. Scoring Vulnerabilities

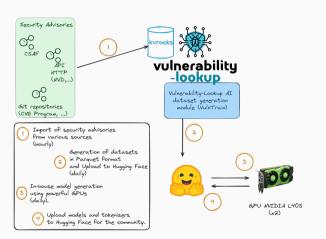
### Why We Are Building Al Models

- CIRCL Al approach<sup>24</sup>: we enhance existing solutions rather than replacing functional systems with NLP/ML/LLM solutions.
- Al-powered **enrichment** of vulnerability descriptions.
- Providing actionable insights to security experts when data is missing or inaccurate (e.g., severity, CWE, CPE information).
- We actively participate in collaborative research and development efforts, such as the EU-funded AIPITCH (AI-Powered Innovative Toolkit for Cybersecurity Hubs) project<sup>25</sup>

<sup>&</sup>lt;sup>24</sup>https://circl.lu/pub/ai-strategy/

<sup>25</sup>https://www.science.nask.pl/en/research-areas/projects/12456

### Model generation workflow



- local training
- models are publicly shared
- regular update

#### **Current Models**

| Model  | Size        | <b>Epochs</b> | Accuracy | Training Time |
|--|-------------|---------------|----------|---------------|
| Severity classification <sup>26</sup>        | 125M params | 5             | 0.8289   | 6.72h         |
| Severity classification (CNVD) <sup>27</sup> | 102M params | 5             | 0.7817   | 65.989m       |
| CWE guessing <sup>28</sup>                   | 125M params | 36-40         | 0.875    | 30m           |

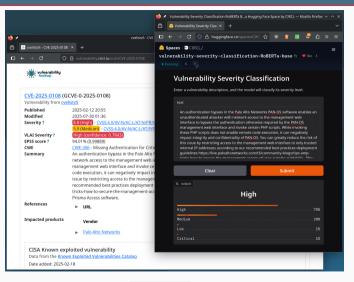
TLP:CLEAR

 $<sup>^{26} {\</sup>rm https://huggingface.co/CIRCL/vulnerability-severity-classification-roberta-base}$ 

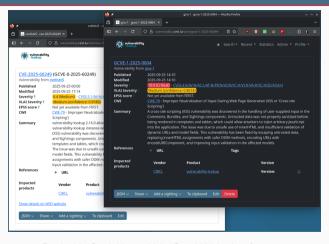
 $<sup>^{27}</sup> https://hugging face.co/CIRCL/vulnerability-severity-classification-chinese-macbert-base$ 

<sup>28</sup> https://huggingface.co/CIRCL/cwe-parent-vulnerability-classification-roberta-base

#### With different CVSS scores



### Vulnerability in Vulnerability-Lookup — published 25 September 2025

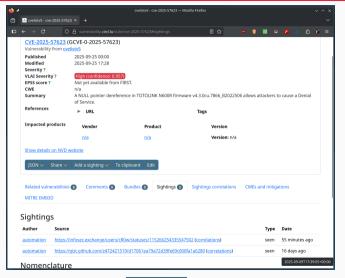


Patched in Cambridge at Vuln4Cast 2025 in the afternoon.

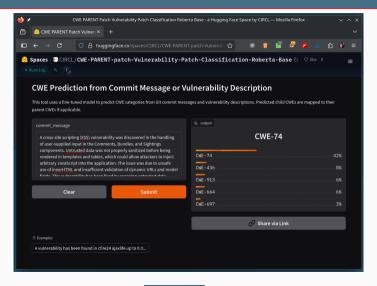
 ${\tt https://github.com/vulnerability-lookup/culnerability-lookup/commit/afa12347f1461d9481eba75ac19897e80a9c7434}$ 



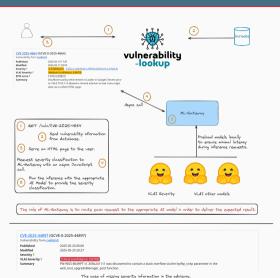
### Few information (reserved 17 September 2025 - sightings since 9 September)



### CWE Guessing (GCVE-1-2025-0004 - CWE 79)



### Integration



- Optional integration
- No dependencies with Vulnerability-Lookup
- Models are pulled from Hugging Face and preloaded locally
- Documented API (OpenAPI) to trigger the inferences
- https://github.com/ vulnerability-lookup/ ML-Gateway

#### **Example**

```
$ curl -X 'POST' \
  'https://vulnerability.circl.lu/api/vlai/severity-classification' \
  -H 'accept: application/json' \
  -H 'Content-Type: application/json' \
 -d '{
  "description": "An authentication bypass in the API component of Ivanti Endpoint
    Manager Mobile 12.5.0.0 and prior allows attackers to access protected
    resources without proper credentials via the API."
31
{"severity": "High", "confidence": 0.8225}
```

Lookup and AI are Cool, but

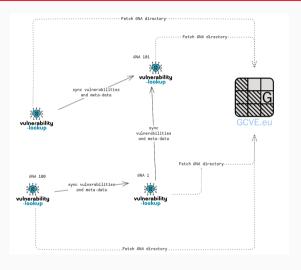
**Publishing is Even Cooler** 

#### GCVE.eu - Role

- The primary role of GCVE<sup>29</sup> is to provide globally unique identifiers to GCVE Numbering Authorities (GNAs).
- GNAs operate autonomously, with full control over how they assign and manage identifiers.
- GCVE publishes Best Current Practices (BCPs) on directory management,
   Coordinated Vulnerability Disclosure (CVD), and publication protocols.
- GCVE maintains and publishes the official directory of all GNAs, including their publication endpoints.

<sup>&</sup>lt;sup>29</sup>https://gcve.eu/

#### **Decentralized Publication Standard**



# Closing

### **Future Development**

- Deeper analysis of the content and context of sightings, including source reliability assessment.
- Full-text search capabilities across all integrated sources.
- Integration of scoring models such as Vuln4Cast<sup>30</sup>, with testing planned on our dataset to enhance reproducibility.
- Improved notification capabilities for newly observed vulnerabilities via webhooks.



The project is evolving rapidly — feedback and feature suggestions are always welcome!

<sup>30</sup> https://github.com/FIRSTdotorg/Vuln4Cast

#### References

★ https://www.vulnerability-lookup.org

CIRCL public instance https://vulnerability.circl.lu

Source code https://github.com/vulnerability-lookup/vulnerability-lookup

Dataset, Al Model Training, Models
https://github.com/vulnerability-lookup/VulnTrain