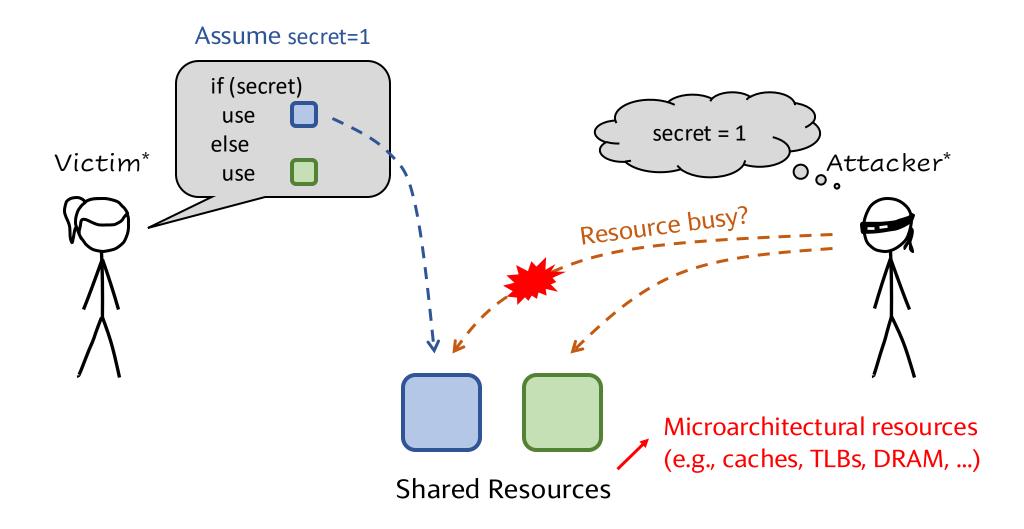
ECE 382N-Sec (FA25):

## L2: Side Channels in Public Clouds

Neil Zhao neil.zhao@utexas.edu

## Previously on ECE 382N: Sharing Resource => Side Channel



<sup>\*</sup>Characters are based on https://xkcd.com/2176 and https://xkcd.com/1808 (under a CC Attribution-NonCommercial 2.5 License)

## Two Steps of a Side-Channel Attack

Step 1: Co-location

Victim

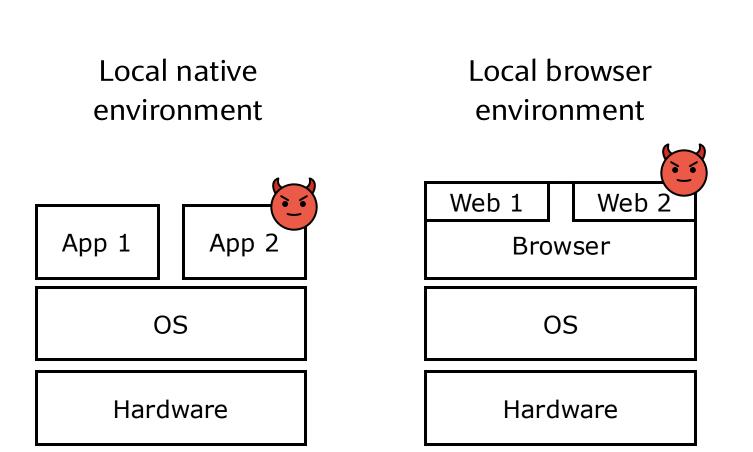
Attacker

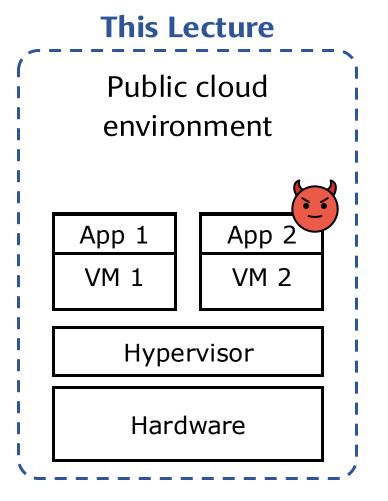
Victim

Attacker

Attacker

#### Three Common Co-location Scenarios



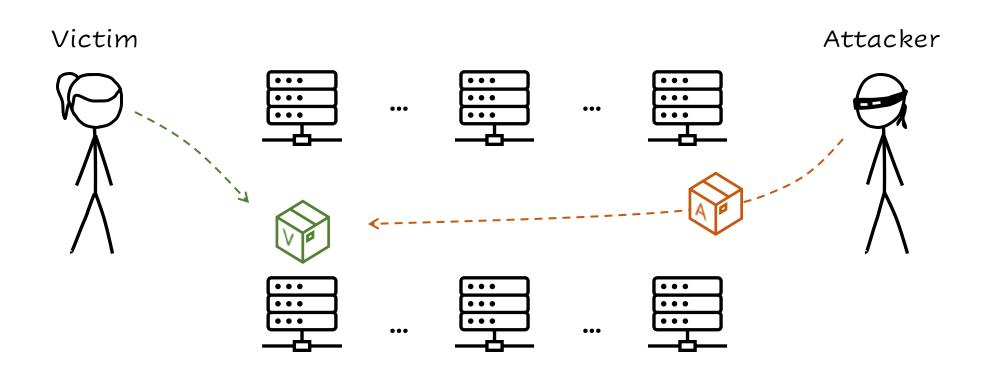


#### Why Public Cloud?

- Public cloud fundamentally relies sharing hardware resources among tenants
- Your VMs are (very likely) always co-located with someone else's VMs
  - Unlike the local setting, the attacker doesn't need to trick you to visit a malicious website or download a malicious app
- Moreover,
  - You cannot control who your "neighbors" are
  - You don't even know who your "neighbors" are

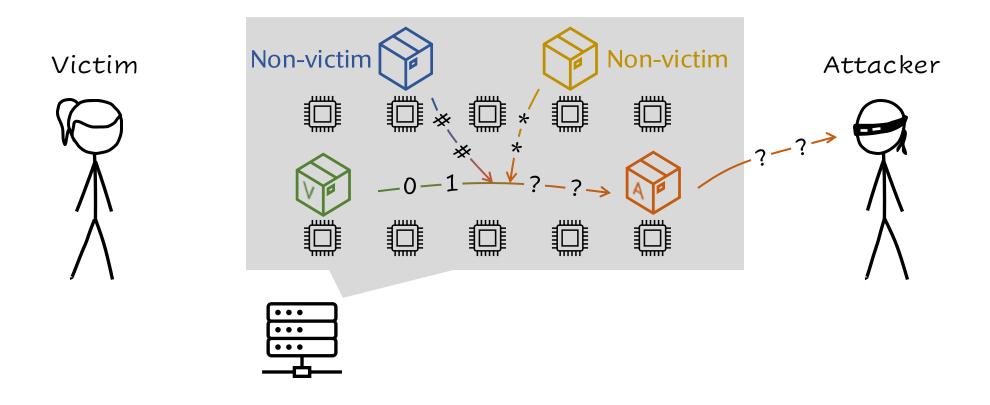
## Why Side Channels in Public Cloud is Hard?

Challenge 1: Co-location with the victim in a vast datacenter



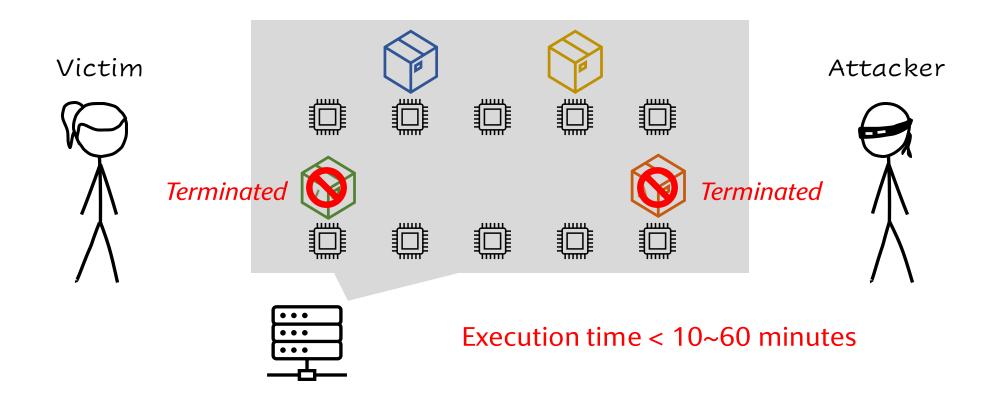
## Why Side Channels in Public Cloud is Hard?

Challenge 2: Production cloud is noisy



#### Why Side Channels in Public Cloud is Hard?

Challenge 3: Modern clouds (e.g., FaaS) are dynamic



#### Cloud Vendors Claim Side-Channel Attacks are Impractical

**Example:** AWS Whitepaper – The Security Design of the AWS Nitro System (Nov. 2022)



#### Paraphrased:

"Last-level cache (LLC) Prime+Probe is impractical due to the noise; therefore, our side-channel mitigations are very strong even if we do not protect VMs against LLC Prime+Probe"

#### Let's Start with Co-location

CCS '09

#### Hey, You, Get Off of My Cloud: Exploring Information Leakage in Third-Party Compute Clouds

Thomas Ristenpart\* Eran Tromer† Hovav Shacham\* Stefan Savage\*

\*Dept. of Computer Science and Engineering University of California, San Diego, USA {tristenp,hovav,savage}@cs.ucsd.edu

3085 citations to date

TComputer Science and Artificial Intelligence Laboratory
Massachusetts Institute of Technology, Cambridge, USA
tromer@csail.mit.edu

#### Tips:

- Be the first
- Find a catchy title
- Form a strong team

#### **Threat Model**

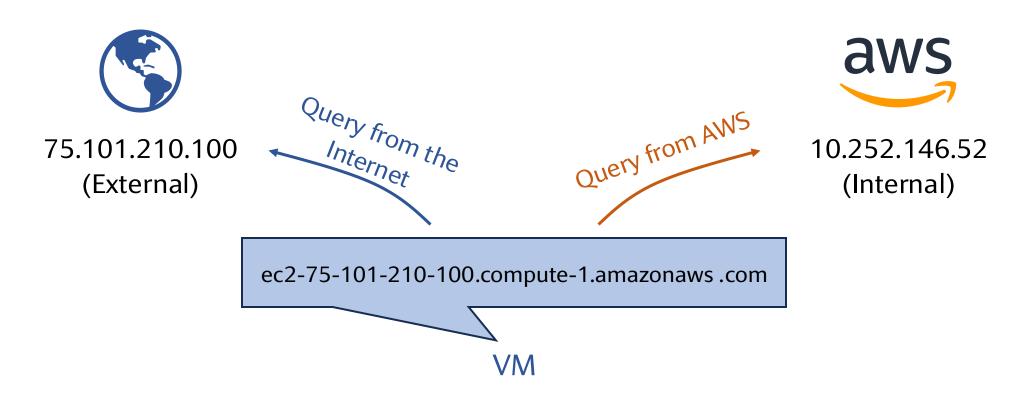
- Attacker-victim co-location is possible (i.e., not sole-tenancy)
- Cloud vendors are trusted
- The attacker is a normal cloud user
  - Has access to typical cloud interfaces available to any customer
  - Can launch many VM instances (20 concurrent VMs)
  - Can run arbitrary code within these VM instances
- The attacker can interact with the victim (e.g., trigger the victim's execution) and has prior knowledge about the victim
- May target a group of users or a specific victim

#### Launching an EC2 VM on AWS (in 2009)



These three parameters determine where a VM is placed

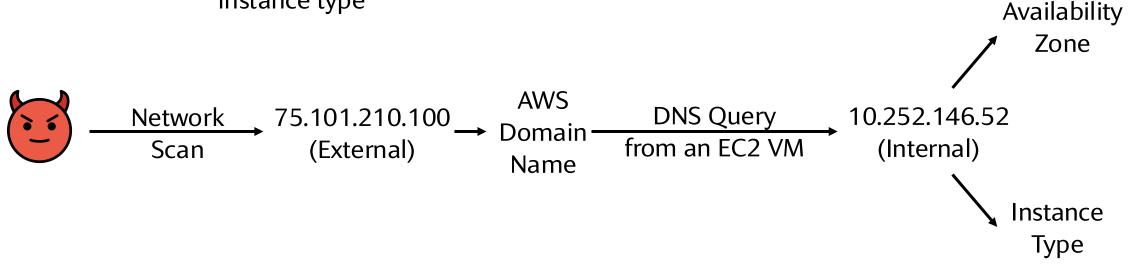
#### Networking of VMs in AWS (in 2009)



Hypothesis: a VM's internal IP depends on its where the VM is placed

#### **Cloud Cartography**

- Method: Launch VMs with different instance types in different zones, record their internal IPs
- Overall findings:
  - Different availability zones use distinct ranges of internal IP addresses
  - An IP /24 prefix (e.g., 10.252.10.\*) mostly corresponds to a specific instance type



#### Network-Based Co-location Checks

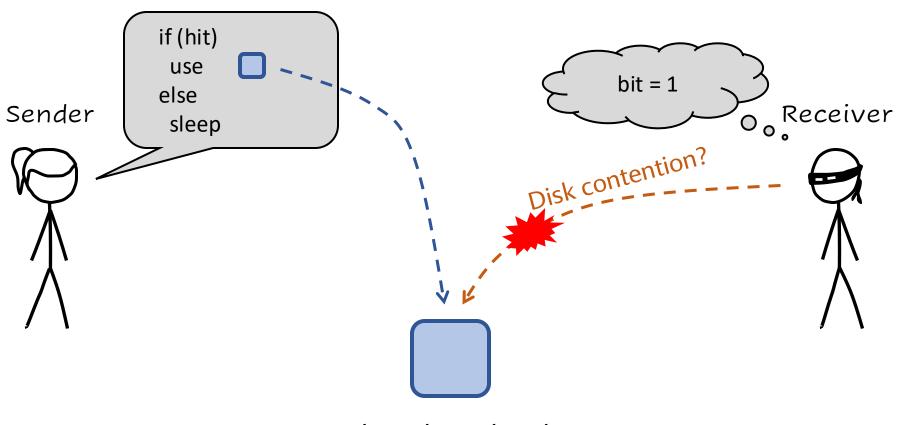
#### VMs 1 and 2 are likely co-located if they have:

- The same IP address of the management Xen VM (i.e., Dom0)
  - By tracerouting from VM1 to VM2
- Small network round-trip time
  - By pinging VM2 from VM1
- Numerically-close internal IP addresses (within 7)
  - By resolving both VMs' domain names within EC2



## Verifying Co-location With a Covert Channel

Send a random 5-bit message



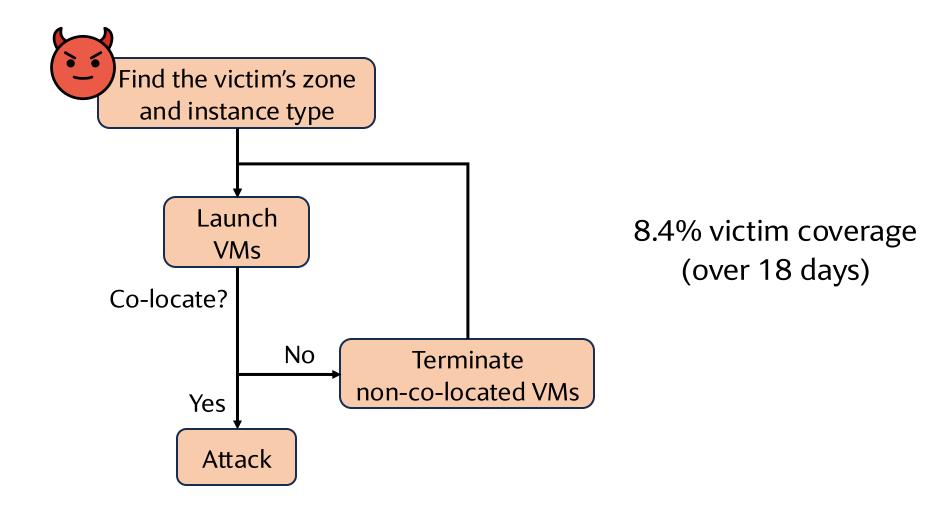
**Shared Hard Disk** 

#### EC2 VM Placement (in 2009)

#### **Empirical observations**

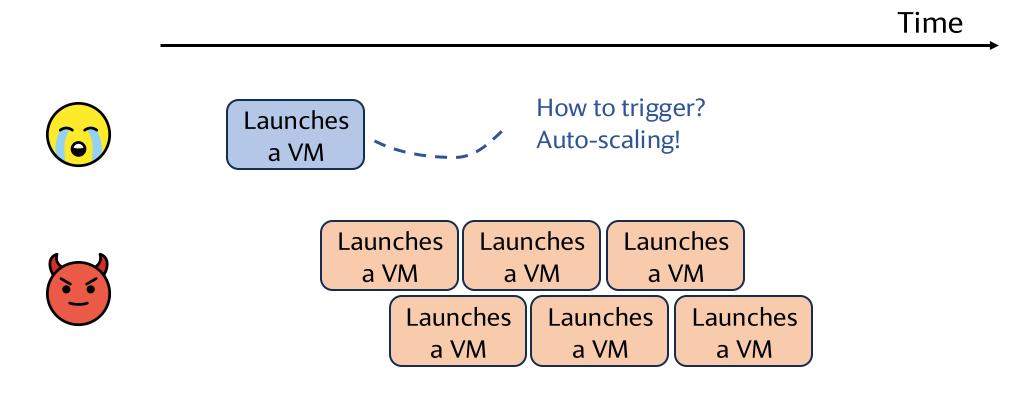
- VMs from the same account never co-locate
  - Good for reliability
  - Also good for the attacker!
- Placement locality:
  - Sequential locality: A new VM prefers the host of a recently terminated VM
  - Parallel locality: Two VMs launched around the same time prefer the same host

#### **Brute-Force Placement**



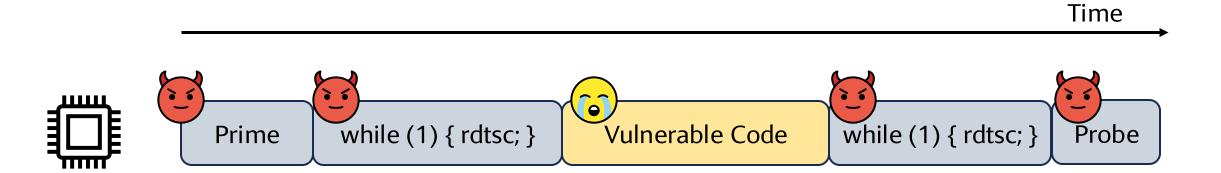
### **Abusing Placement Locality**

Parallel locality: Two VMs launched around the same time prefer the same host



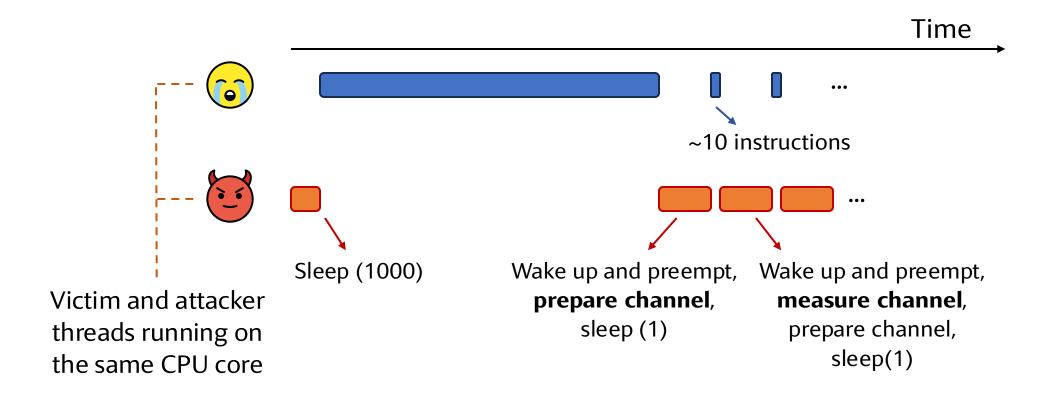
40% of the time the attacker succeeds

## Prime+Trigger+Probe



- Coarse-grained information leakage
- Can detect co-location without network-based techniques
- Can detect keystrokes (in a local environment) with a time resolution of 13ms

#### Gaming the OS Thread Scheduler



Focused mostly on Linux Completely Fair Scheduler (CFS)

#### Some Follow-Up Work (Around 2015)

#### Seriously, get off my cloud! Cross-VM RSA Key Recovery in a Public Cloud

Mehmet Sinan İnci, Berk Gülmezoğlu, Gorka Irazoqui, Thomas Eisenbarth, Berk Sunar Worcester Polytechnic Institute, Worcester, MA, USA Email:{msinci, bgulmezoglu, girazoki, teisenbarth, sunar}@wpi.edu

Demonstrated LLC Prime+Probe on AWS

#### Some Follow-Up Work (Around 2015)

# A Placement Vulnerability Study in Multi-Tenant Public Clouds

Venkatanathan Varadarajan, *University of Wisconsin—Madison;* Yinqian Zhang, The Ohio State University; Thomas Ristenpart, Cornell Tech; Michael Swift, University of Wisconsin—Madison

https://www.usenix.org/conference/usenixsecurity15/technical-sessions/presentation/varadarajan

High-speed covert channel -> Fast co-location detection

# A Measurement Study on Co-residence Threat inside the Cloud

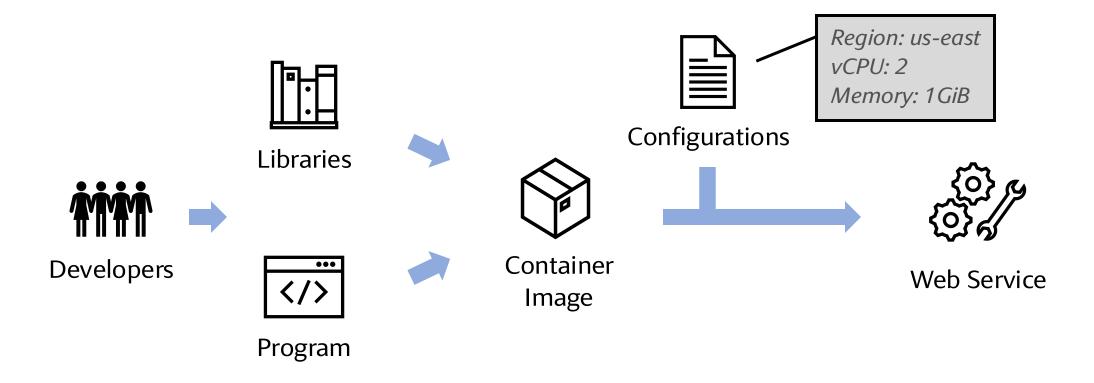
Zhang Xu, College of William and Mary; Haining Wang, University of Delaware; Zhenyu Wu, NEC Laboratories America

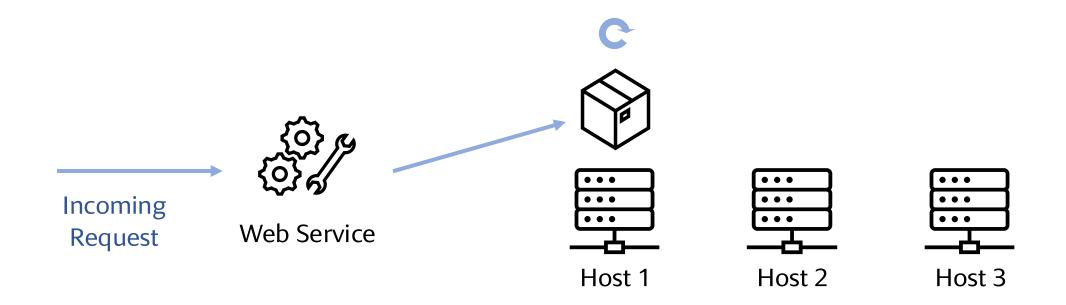
https://www.usenix.org/conference/usenixsecurity15/technical-sessions/presentation/xu

Revisited network-based co-location tests

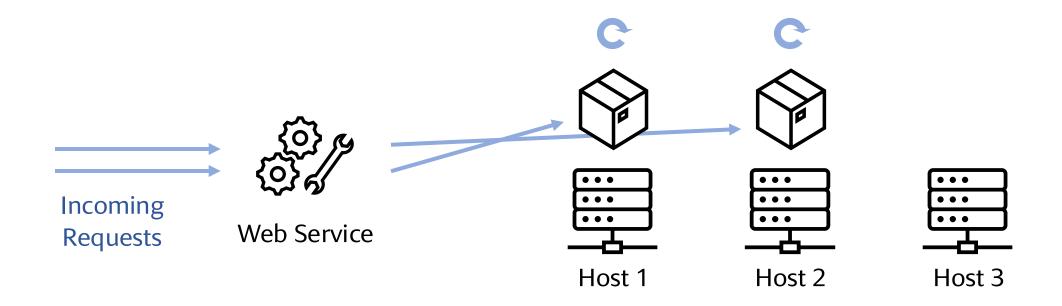
#### What Changed from 2009 and 2015

- Virtual private cloud => network isolation between tenants, cloud vendors hide traceroute information
- More servers => Harder to co-located
- More powerful hardware => More tenants on the same node and thus more noise
- The widespread of non-inclusive LLC
- Container + Function-as-a-Service (FaaS)
  - Short lifetime
  - High background noise

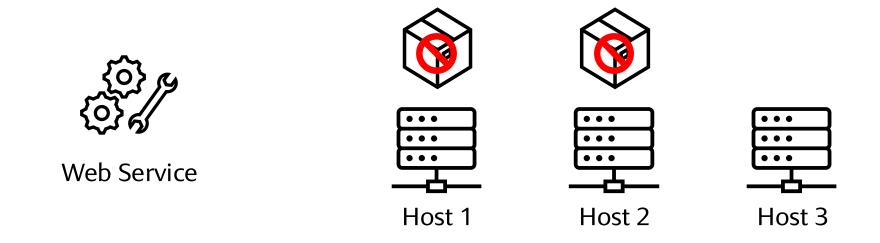




Cloud vendor automatically launches a container instance (The instance placement is managed by the vendor)

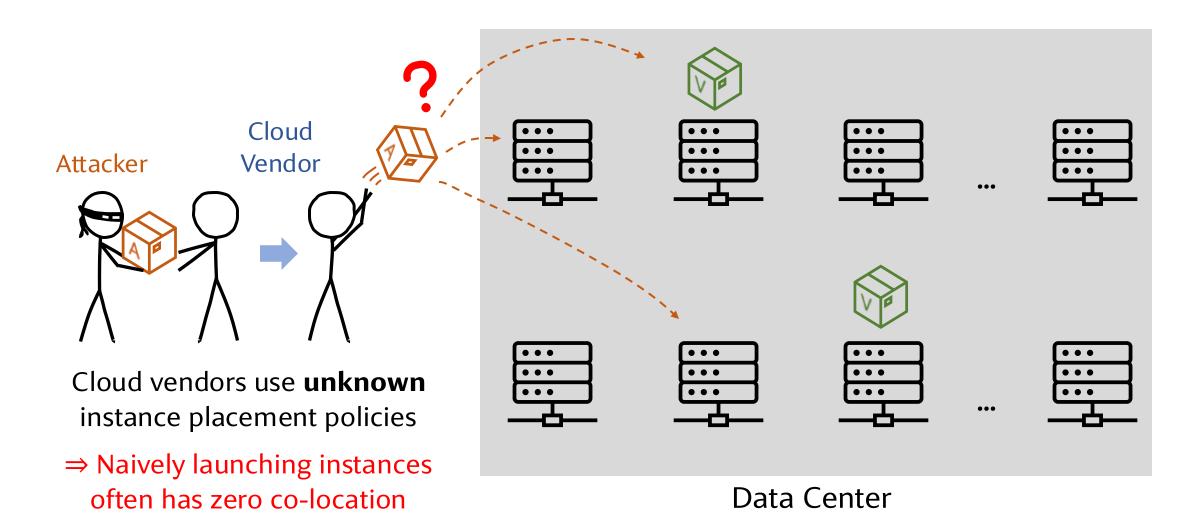


Cloud vendor launches more instances to handle traffic increases

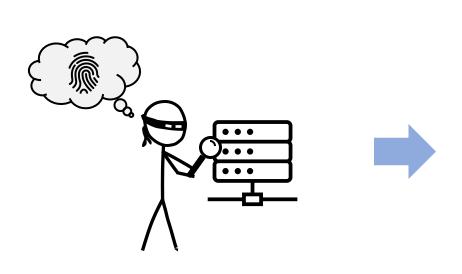


Cloud vendor automatically terminates idle instances

## Fog of War: Container Instance Placement

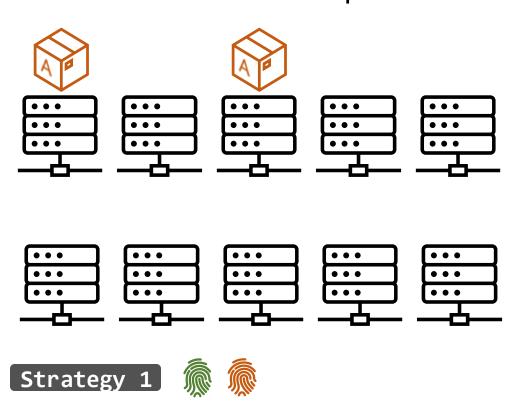


## Idea: Fingerprint Host → Reverse Engineer Placement Behavior

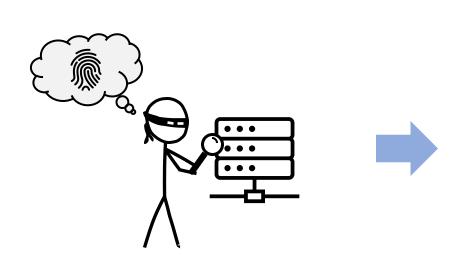


Accurate host fingerprinting

#### Understand container placement

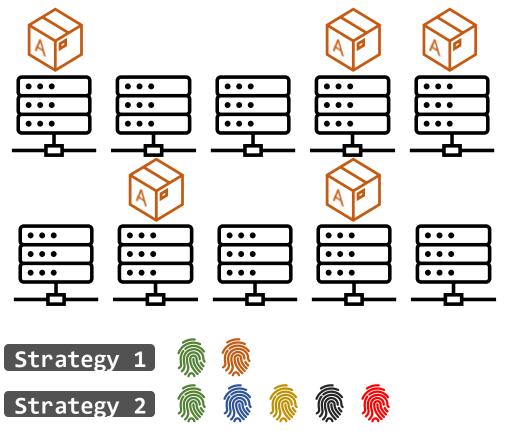


### Idea: Fingerprint Host → Reverse Engineer Placement Behavior

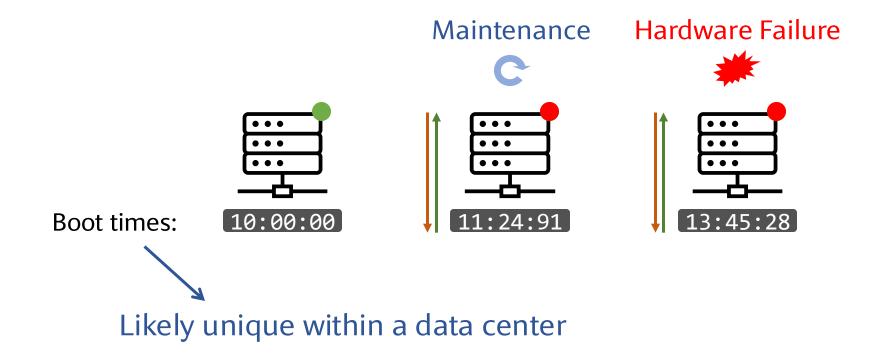


Accurate host fingerprinting

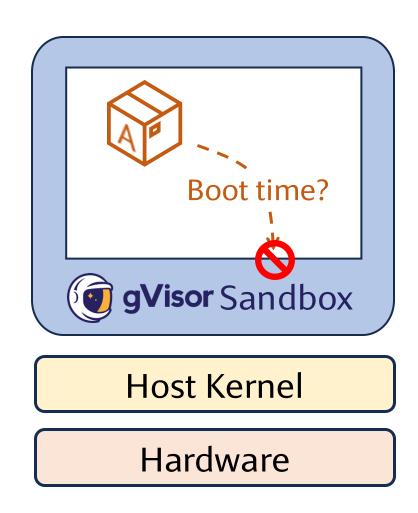
#### Understand container placement



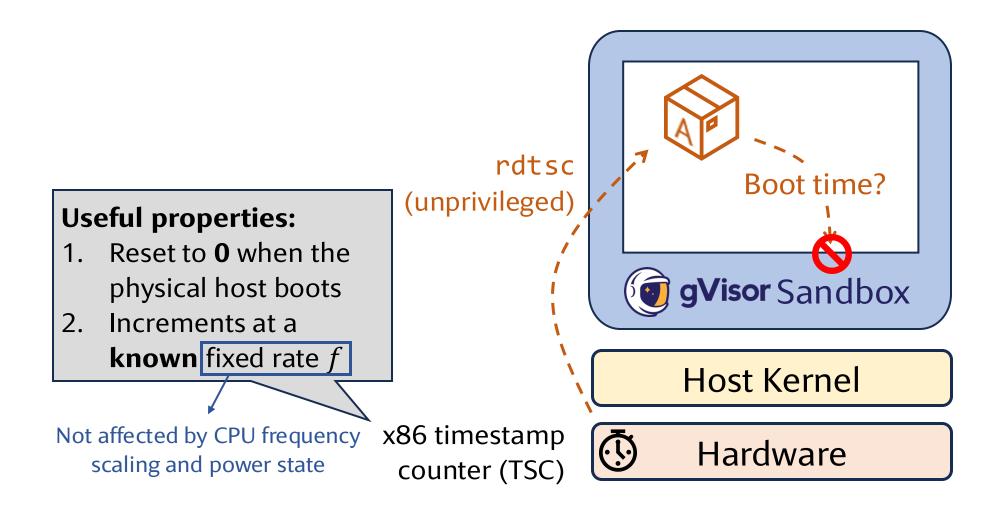
### Insight 1: Physical Host's Boot Time as Fingerprint



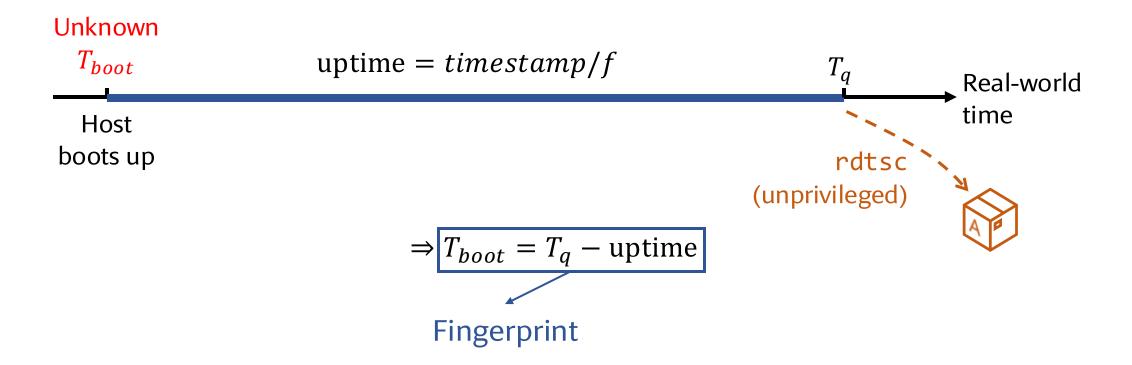
## Challenge: Host Information is Hidden Due to Sandboxing



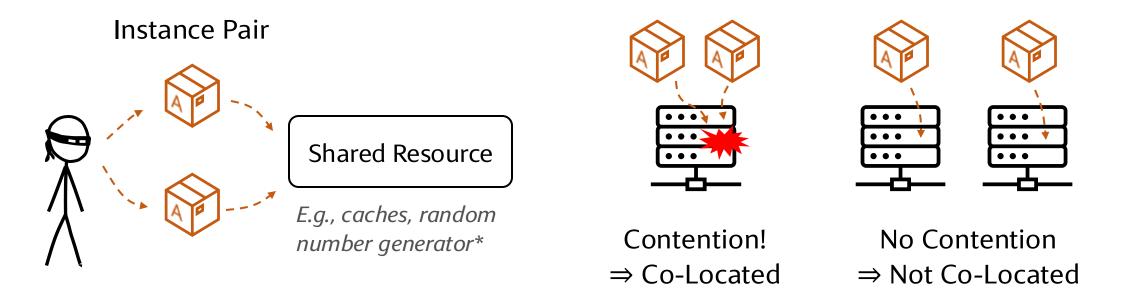
## Insight 2: Bypassing Software Protection by Asking the Hardware



#### Derive Boot Time From Timestamp Counter

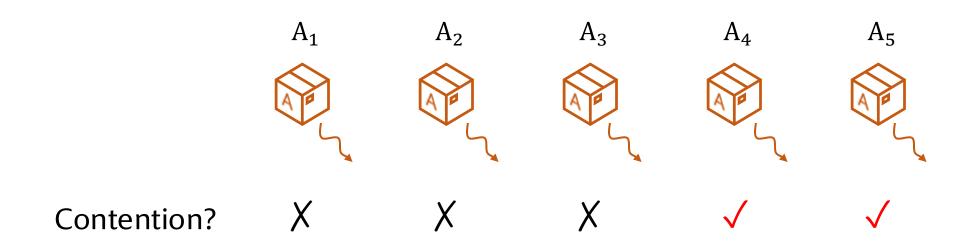


### Verifying Co-Location



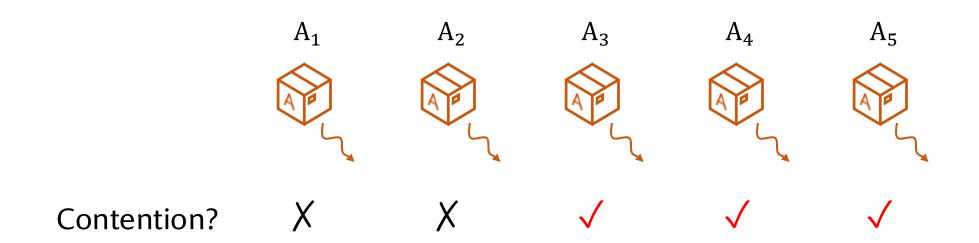
**Scalability issue:** it requires  $O(N^2)$  pairwise tests to verify N containers

<sup>\*</sup> Evtyushkin et al., Covert Channels through Random Number Generator: Mechanisms, Capacity Estimation and Mitigations (CCS '16)

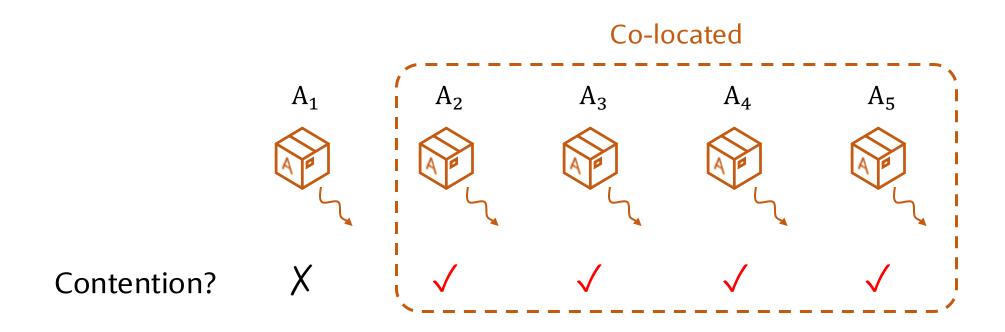


 $A_1, A_2, A_3$  do not co-locate with any other instance (i.e., they are *single instances*)

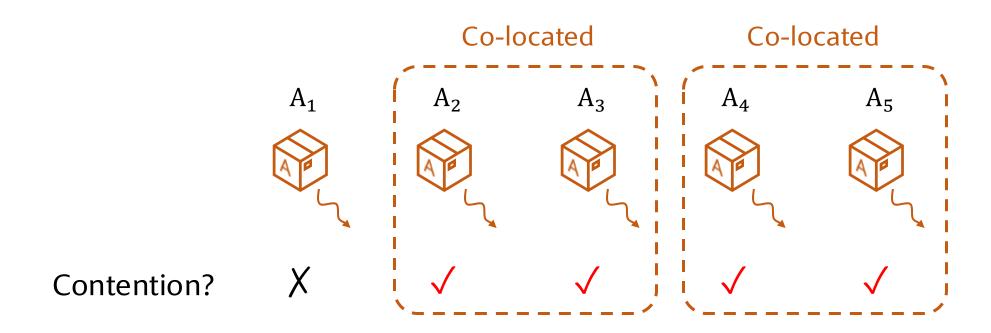
A<sub>4</sub> and A<sub>5</sub> are co-located



 $A_3$ ,  $A_4$ ,  $A_5$  are co-located



 $A_2, A_3, A_4, A_5$  are co-located? Not sure!

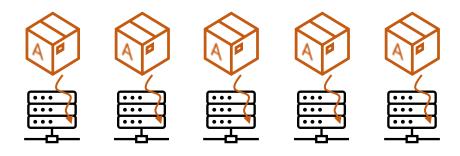


 $A_2, A_3, A_4, A_5$  are co-located? Not sure!

### **Batch Testing Strategies**

Truly not co-located

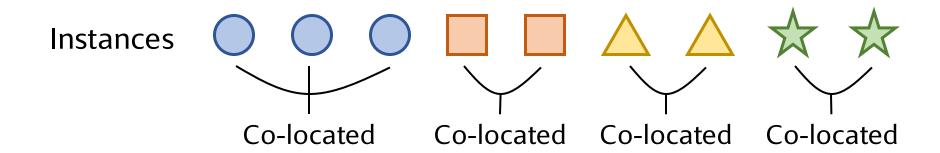
Truly co-located

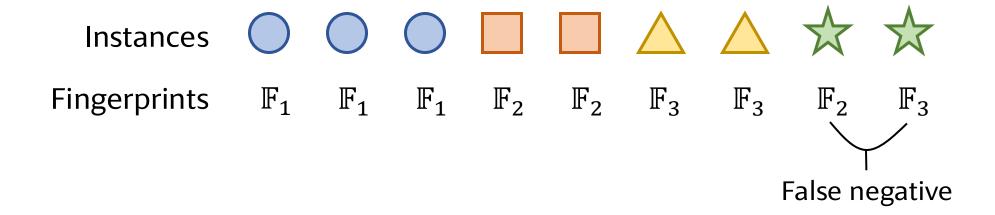


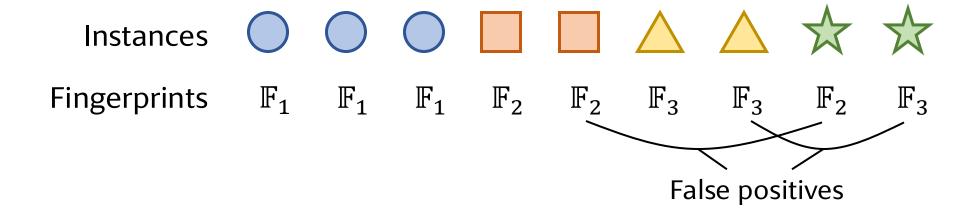
Batch test all instances at once

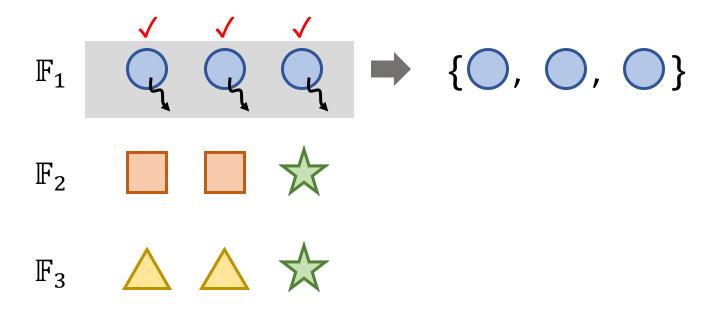
Batch test 3 instances at once

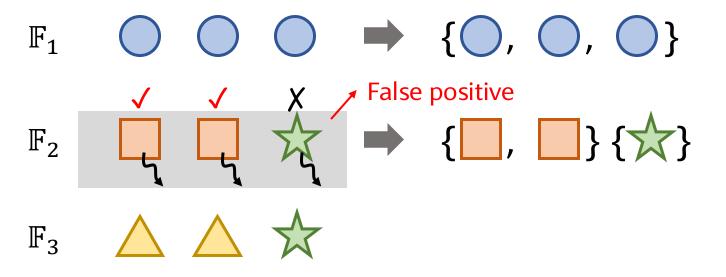
If fingerprints are accurate, they can provide hints on which instances are likely co-located

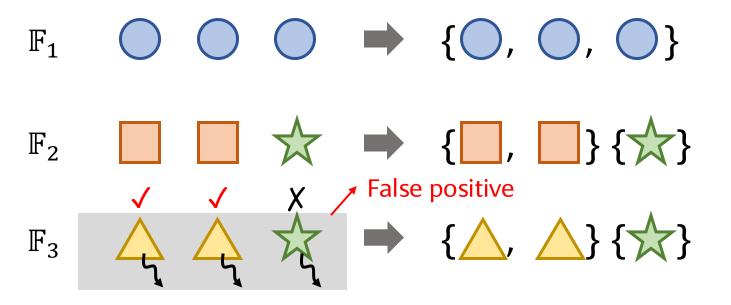


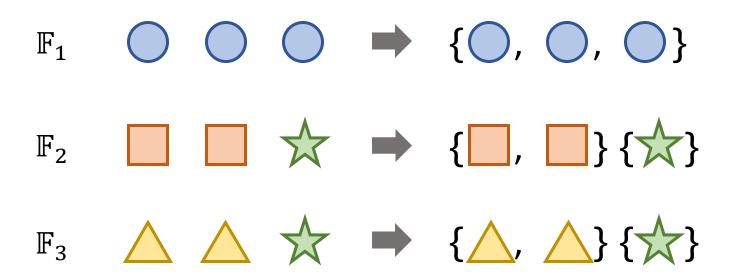




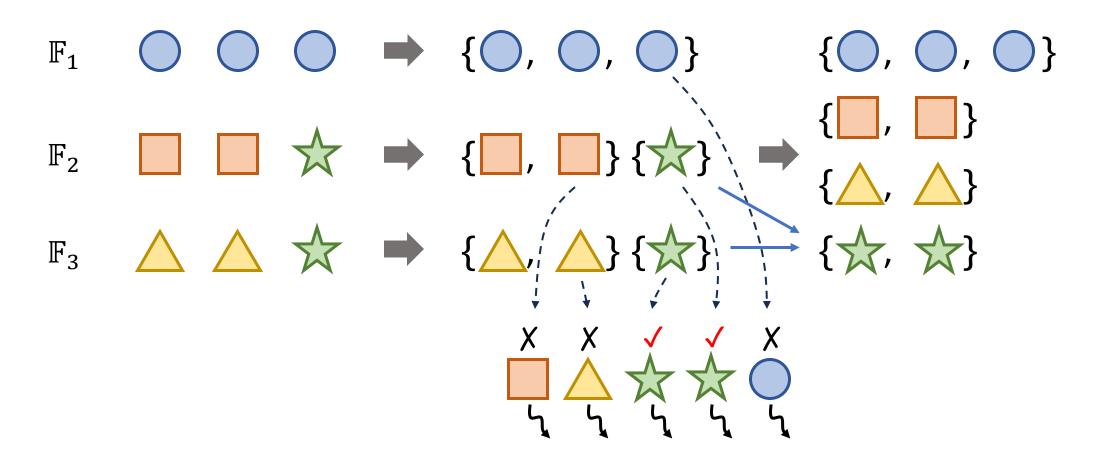


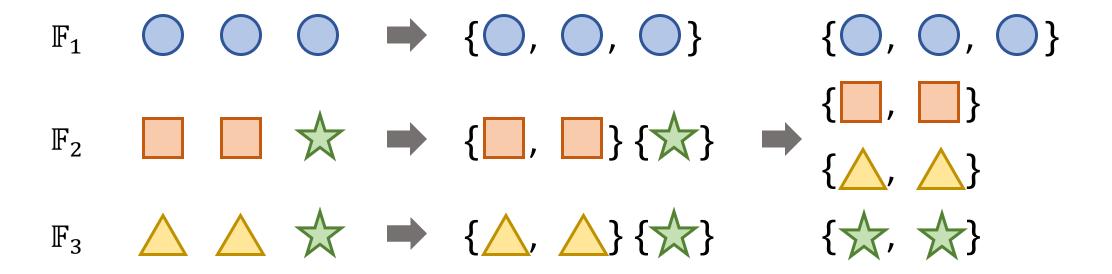


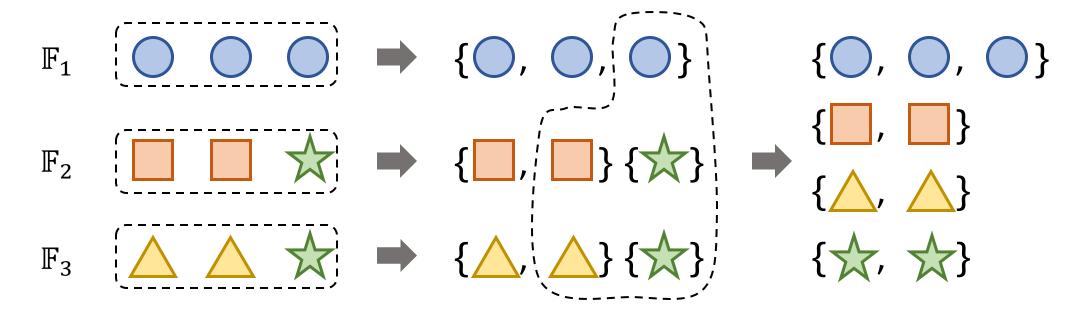




All false positives are identified, proceed to find false negatives







4 batch tests instead of  $9 \times 8/2 = 36$  pairwise tests

More discussion in the post-lecture reading

### Host Fingerprints are Highly Accurate

#### For each pair of container instances

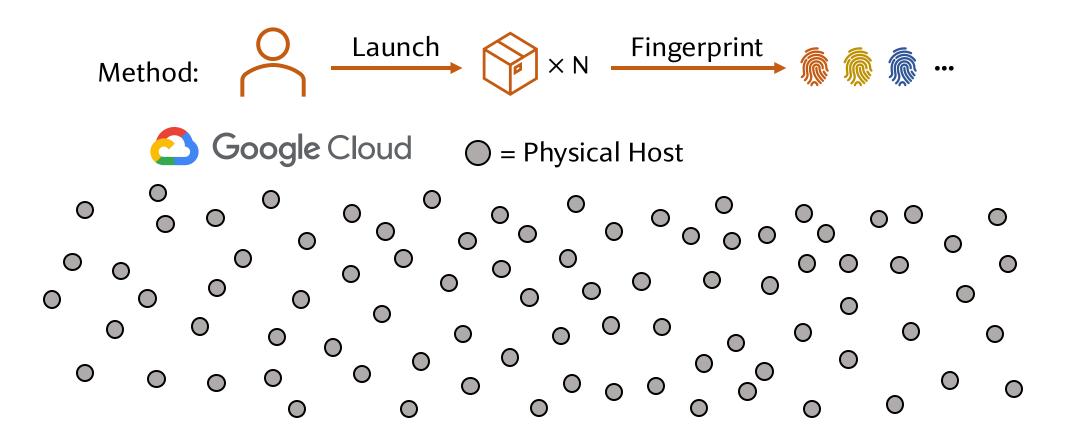
- **False positive (FP):** same fingerprints but not co-located
- **False negative (FN):** different fingerprints but co-located
- Measure accuracy in three data center regions (us-central1/east1/west1)
- Repeat measurements five times in each data center region

Average FN rate: 0.00%

Average FP rate: 0.02%

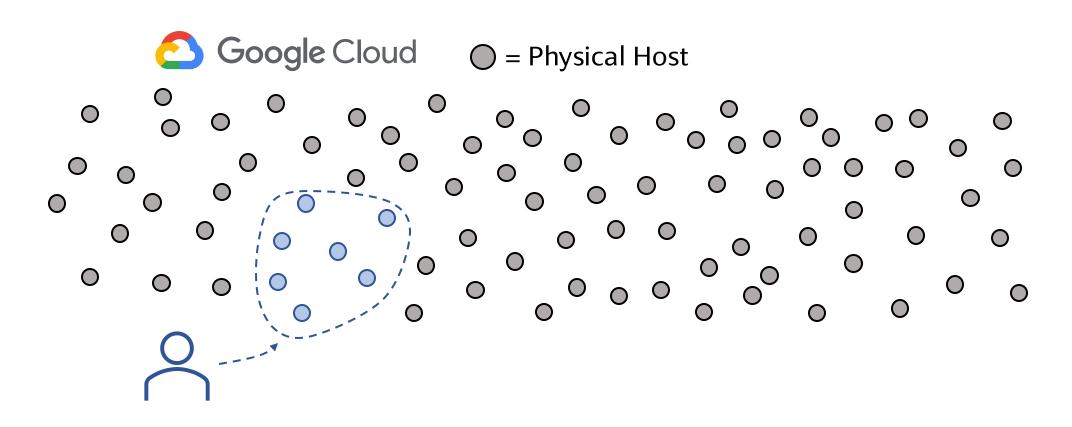
© 14 out of 15 measurements generate perfect fingerprints (no FP nor FN)

### Understanding Instance Placement Policy



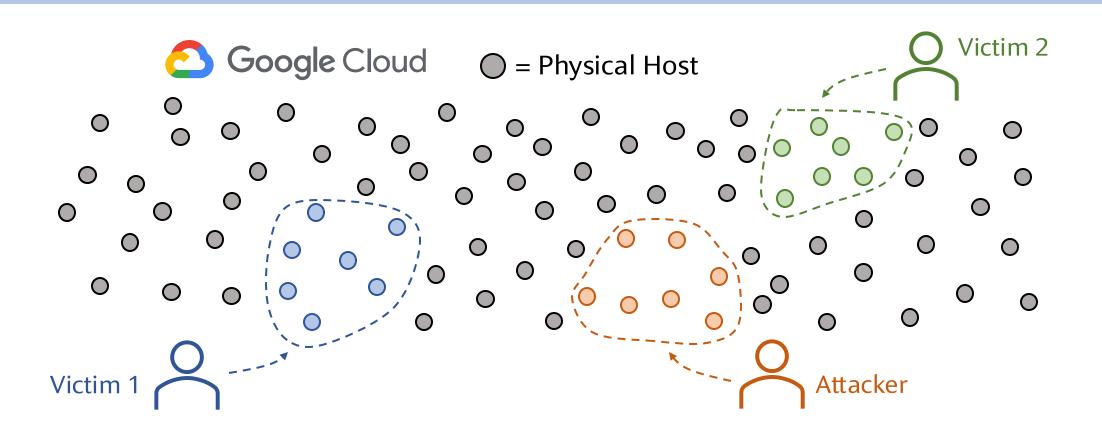
### Observation 1: An Account Has a Preferred Set of Hosts

Why: Affinity scheduling to reduce communication overhead

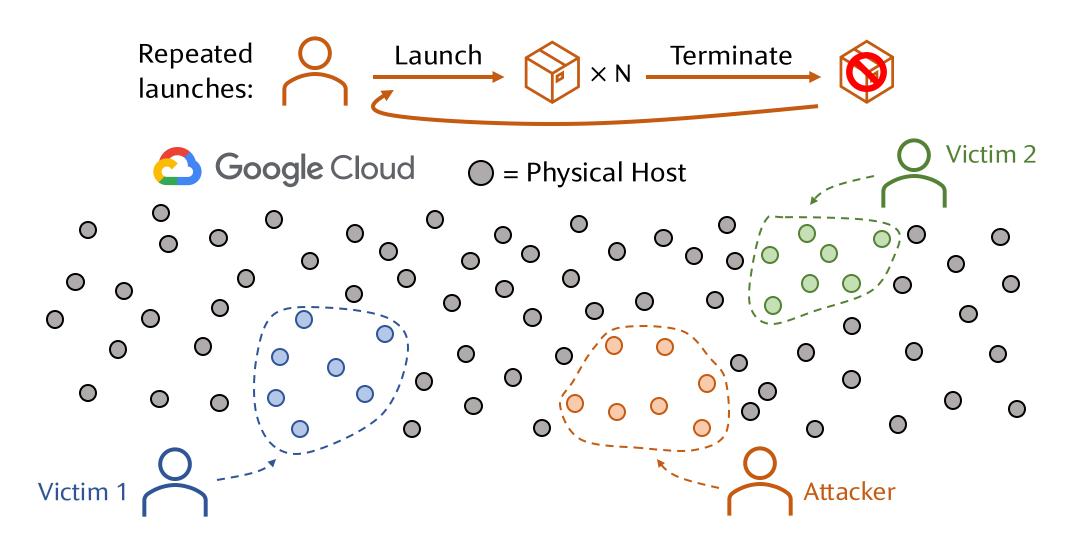


### Observation 2: Different Accounts Have Different Preferred Hosts

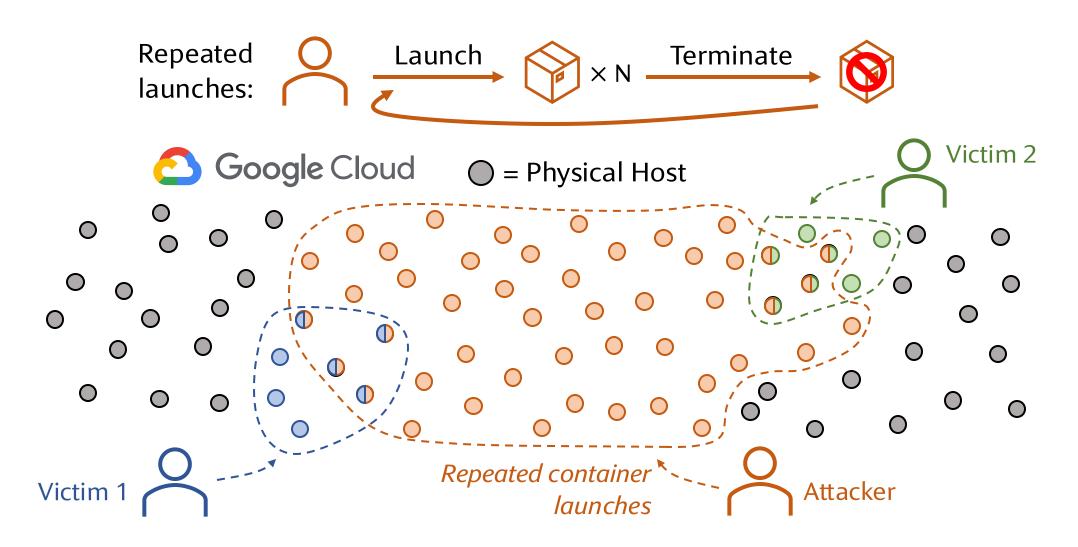
#### **Implication:** Low chance of co-location with a target user



### Observation 3: Repeated Launches Spread Instances

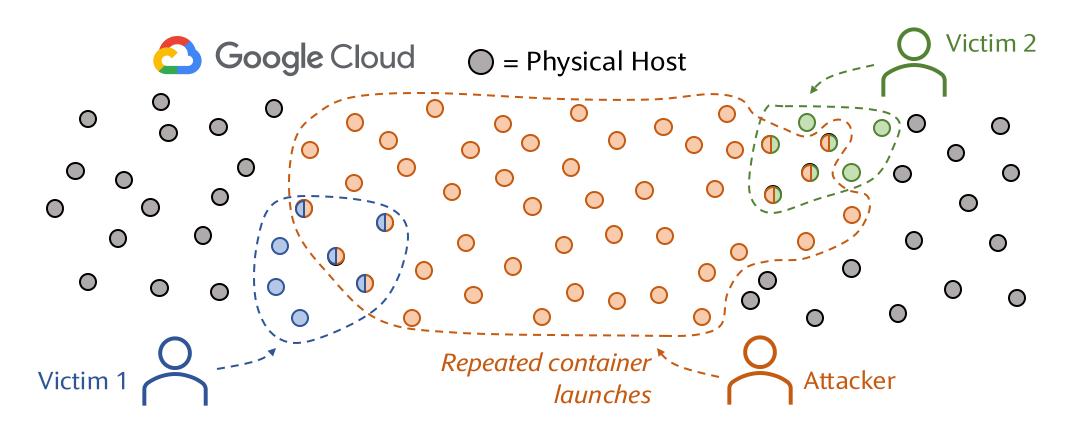


### Observation 3: Repeated Launches Spread Instances

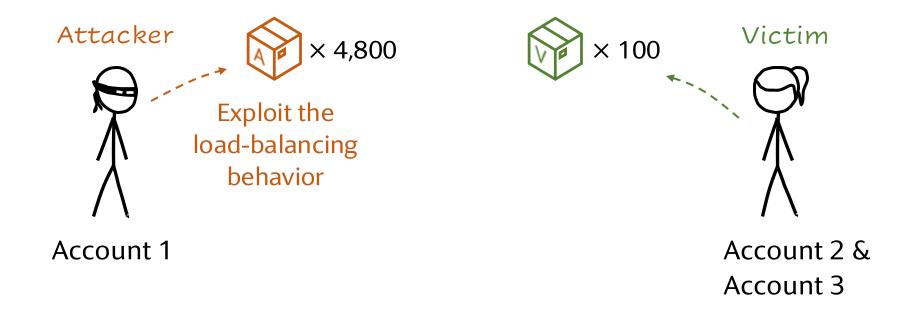


### Observation 3: Repeated Launches Spread Instances

**Why:** Repeated launches ⇒ User has high demand ⇒ Load balance



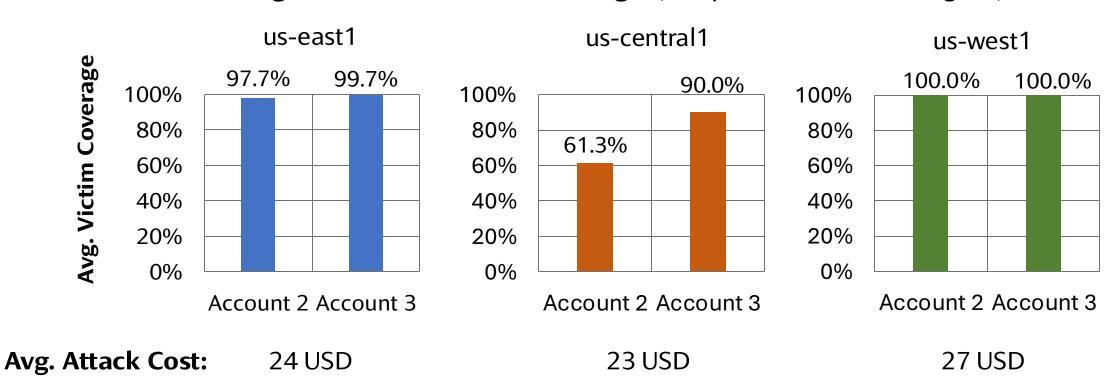
### **Evaluation: Co-Location with Victims**



Victim coverage: Percentage of victim instances that are co-located with the attacker

### High Victim Coverage and Low Attack Cost

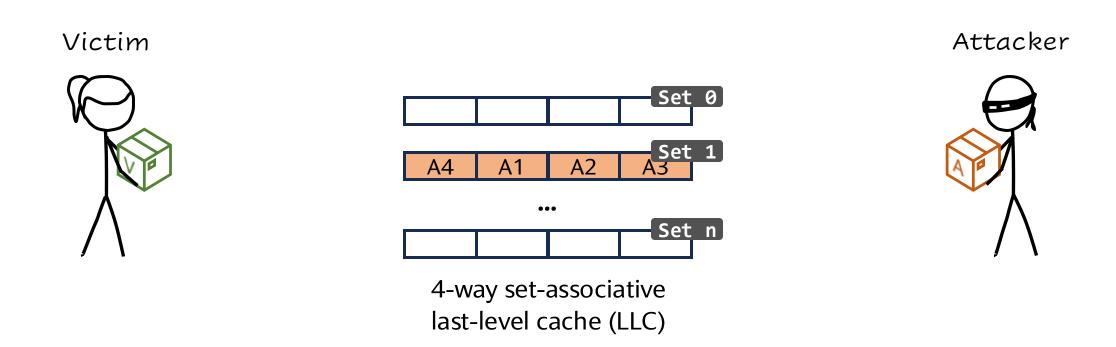
#### **Average Victim Instance Coverage** (3 repetitions in each region)



**Takeaway:** High victim coverage and low attack cost

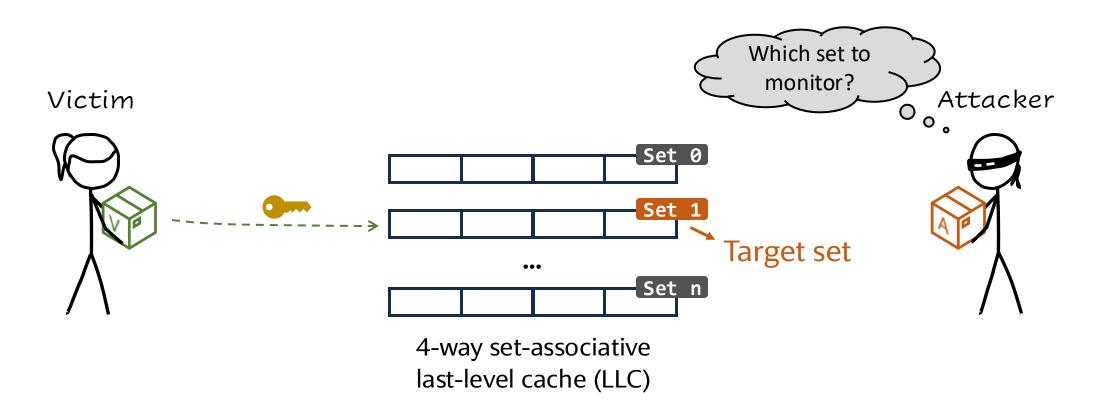
### LLC Prime+Probe Attack with an Eviction Set

Eviction set ⇒ Monitor memory accesses to an LLC set with **Prime+Probe** 



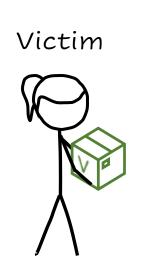
# An Unprivileged Attacker Does Not Know the Target Set

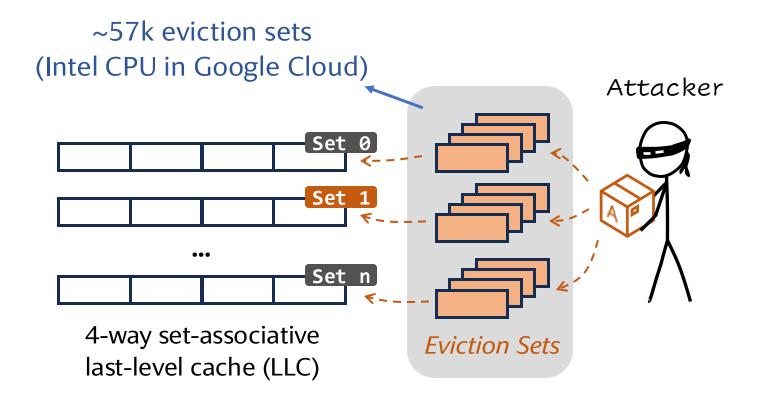
Target set: An LLC set accessed by the victim in a secret-dependent manner



### Step 1: Build Many Eviction Sets

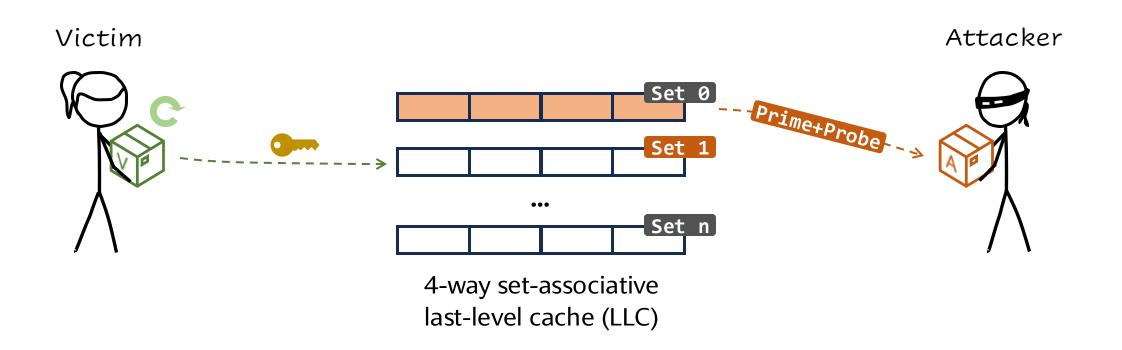
Attacker needs an eviction set for every LLC set in the system





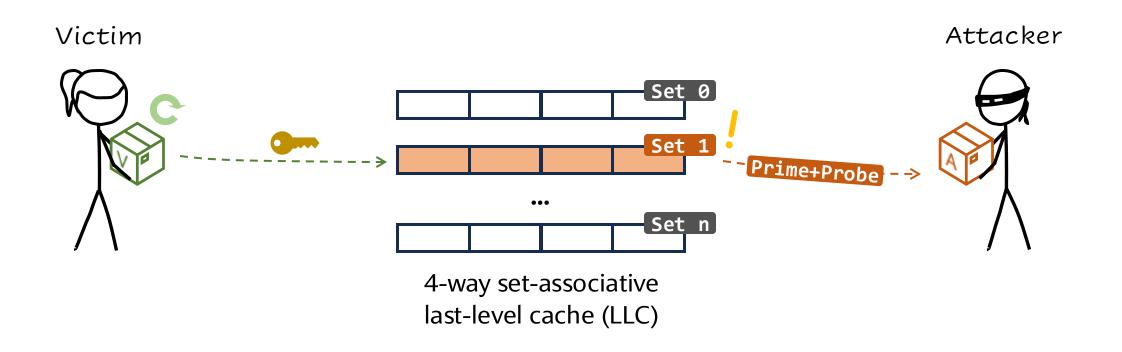
### Step 2: Identify Target LLC Set to Monitor

Attacker collects an access trace from *each* LLC set ⇒ Checks whether the access trace matches victim's access behavior



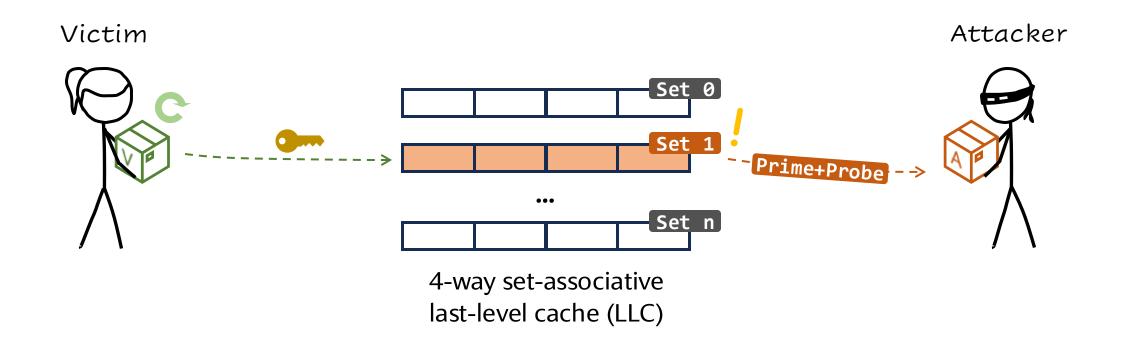
### Step 2: Identify Target LLC Set to Monitor

Attacker collects an access trace from *each* LLC set ⇒ Checks whether the access trace matches victim's access behavior



### Step 3: Extract Information from the Victim

Attacker monitors the target set and extracts the sensitive information



### Victim: Elliptic Curve Digital Signature Algorithm (ECDSA)

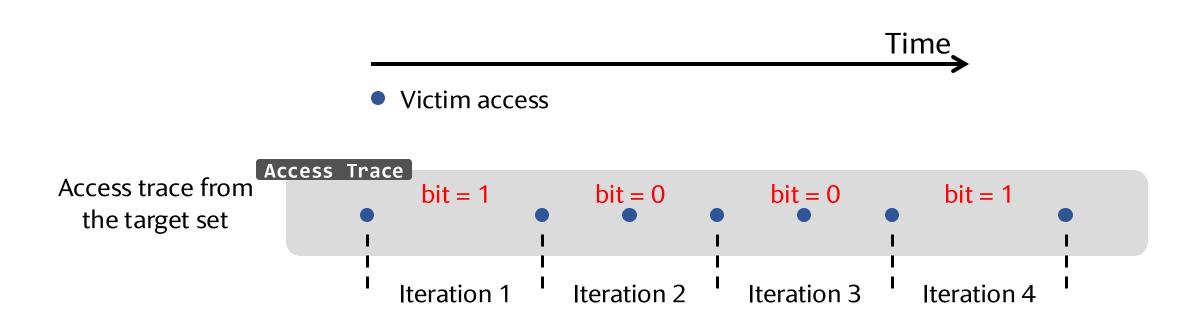
Target victim: A vulnerable ECDSA program from OpenSSL 1.0.1e

**Setup:** The victim runs in a container owned by a different Google account

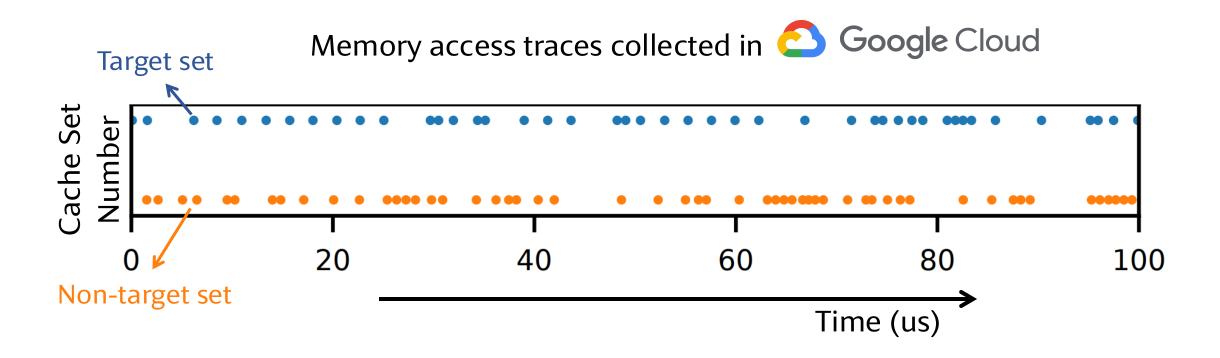
#### **Simplified victim code**

```
for bit in secret_nonce {
    // ...
    if (!bit) {
        Fetch Victim Address;
    }
    // ...
    Fetch Victim Address;
}
```

## **Expected Access Trace from the Target Set**

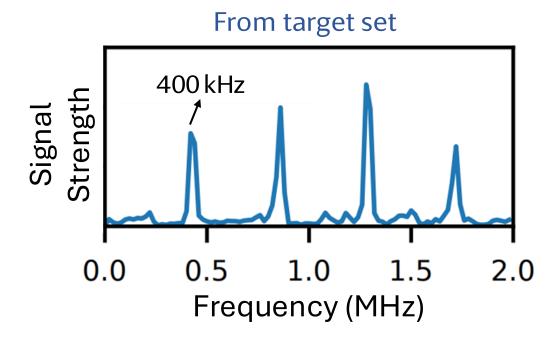


### Actual Access Traces Collected in Google Cloud



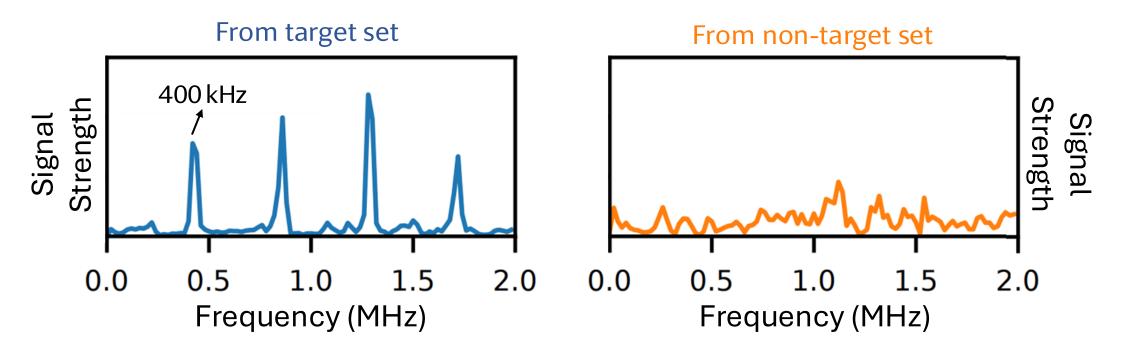
# New Technique: Identify Target Set via Spectral Analysis

**Intuition:** Victim accesses are periodic ⇒ Spectral analysis



# New Technique: Identify Target Set via Spectral Analysis

**Intuition:** Victim accesses are periodic ⇒ Spectral analysis



**Result:** Find the target set in ~3 minutes, 74% success rate



#### Legends

- Attacker Container
- Victim Container
- :: Task Running
- ✓ Task Completed
- X Task Failed
- Victim Found

#### Attack stage:

#### Not Started

Preflight Next Repeat Reset

Running Time: 0.0s

Attacker Count: 0

Server Count: 0

Cost: \$0

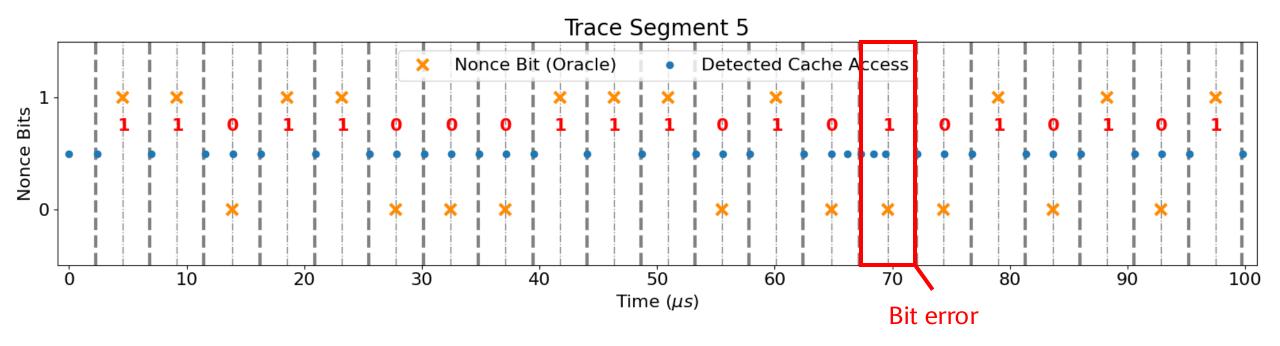
**Attack Traces:** 

WebSocket Status: Connected

Mode: Live Switch

### **Extracted Traces**

Percentage of Secret Bits Extracted: 88.4%; Error rate: 2.8%;



### Next Two Lectures: Defenses to Side Channel

- Partitioning => Limit the sharing
- Randomization => Obfuscate the usage
- Detection => Catch the offender

#### A Few Announcements and Reminders

- Please sign up for paper discussion if you haven't
  - Will randomly map students to papers after Weds
- I will go over some of the paper reviews next lecture and answer the discussion questions. I'll grade them later this week
- May further reduce the reading load
  - 2 pre-lecture + 1 review / week or
  - 2 reviews / week