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The Developer's View to Secure an Application and Data on NVIDIA H100 with Confidential Computing





- Why Confidential Computing Matters
- How Confidential Computing Protects Data In-Use
- Expanding Trusted Execution Environments to Hopper H100
- CUDA Coding Considerations





Al Driving Transformation Across Industries Driving Deeper Insights I Accelerating Product Innovation I Powering Greater Efficiencies



Financial Services Banking | Insurance | Payments



96% of organizations have AI initiatives in pilot¹

¹NewVantage Partners, "Data and AI Leadership Executive Survey", 2022; ²McKinsey, "State of AI in 2021", 2021



Consumer Internet Ecommerce | Social Media | Video Conferencing



92% of organizations are increasing their Al investments¹





Healthcare and Life Sciences Medical Devices | Smart Hospitals | Genomics

67% see increase in revenue²



79% see significant cost savings²

Data Privacy and Security Can be a Barrier to Deriving Value from Al Attacks Follow Value... and Data is Valuable

Sensitive | Regulated | Private

- Protected Health Information (PHI)
- Credit Card Holder Information
- Credit Reports & Credit Card Transactions
- Banking / Financial Transactions
- Enterprise Operational Data
- Intellectual Property (Including Al Models)





¹Cost of a Data Breach 2022 Report, IBM : https://www.ibm.com/reports/data-breach



\$4.35M Global Average Total Cost of a Data Breach¹

\$10.10M Average Cost of Breach in Healthcare¹

Growing Need for Regulatory Compliance

- HIPAA Health Insurance Portability and Accountability Act
 - PCI DSS Payment Card Industry Data Security Standard
 - GLBA Gramm-Leach-Bliley Act
 - **GDPR General Data Protection Regulation**
- CCPA California Consumer Privacy Act

\$9.23 Average Cost of Breach in Finance¹





The Security Gap in **Data Protection** Data in Transit Data at Rest ____ ())---0----------SECURE SECURE



Confidential Computing Overview



Industry Standards Engagement

Benefits:

- Informed on industry direction
- Ability to influence specifications
- Alignment with customers

CC Enables A Holistic Data Security Model

• Protect data at rest, in transit, and in use Protect data and code from other users Protect and code from machine owners

Other Members:

- Google
- AMD
- NVIDIA

- Microsoft
- Intel
- Meta





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Data Security and Privacy

- increasing levels of integrity and confidentiality
- Digital Asset Protection
 - devices can now include more sensitive data
 - prevent unauthorized access with end users
- Datacentric Trust Enables New Collaboration
 - datasets (e.g., healthcare data)

Key Market Uses Data is Power

Provides agility to quickly adhere to ever-evolving regulatory regimes requiring

System owner-operators reduce their cost liability from potential bad-actor employees

Hardware-based security features enable extension of deployment styles: edge

ISVs or Model creators can require their solution work only on Confidential GPUs to

• Federated learning enables training of networks without providing access to sensitive

 Internal groups –previously isolated from each other –within a single company may now be able to share data with each other without confidentiality requirements











NVIDIA Confidential Computing Goals

Protect data in use for accelerated computing

Run CUDA applications unchanged

Offer scale from multi-instance GPUs to multi-node







A Brief Introduction to Encryption & Authentication



- Both sender and receiver require the same key
- The key will both encrypt and decrypt the payload



Key Based Encryption Symmetric Keys

Symmetric encryption utilizes a common password called a "Private Key"







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Symmetric Key Encryption E.g., AES

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- How do I exchange the keys?
- How do I know the receiving end is who I think it is?









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- How do I exchange the keys?
- How do I know the receiving end is who I think it is?











- How do I securely exchange the keys?
- How do I know the receiving end is who I think it is?



Symmetric Key Encryption E.g., AES

is 2-fold: keys? is who I think it is?







- The keys are often called "Public" and "Private"



Enter: Asymmetric Keys A Public/Private Keypair

Asymmetric Keys are created from a complex mathematical operation involving very large prime numbers

The keys are relationally bound, however, (pragmatically) unable to directly derive one from the other

Asymmetric keys can be used both for encryption and 'authentication', or verifying the integrity of a payload

----BEGIN RSA PRIVATE KEY-----**MIICXQIBAAKBgQCNuXqfGicdfx** ----END RSA PRIVATE KEY-----



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Encryption

- The Public key is used to encrypt data
- Only the Private key can be used to decrypt it



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Encryption vs. Authentication

Encryption Keeps Your Information Secure



Encryption

- The Public key is used to encrypt data
- Only the Private key can be used to decrypt it



Encryption vs. Authentication

Authentication Keeps Your Information Accurate



Authentication

The Private Key is used to create a "signature"

Only the Public Key can be used to verify it is accurate







• Public keys can be published online, as they can only be used to encrypt data, not decrypt



Asymmetric Key Encryption How It Helps Supplement Security





- You use the published public key to encrypt your data



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Asymmetric Key Encryption How It Helps Supplement Security

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- You use the published public key to encrypt your data
- Only the owner of the private key can decrypt it



Asymmetric Key Encryption How It Helps Supplement Security

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• What if a bad-actor acts as an impostor?



Attestation





- What if a bad-actor acts as an impostor?
- They can pretend to be a legitimate public-key-provider











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How to Prove Identity









- What if a bad-actor acts as an impostor?
- They can pretend to be a legitimate public-key-provider
- And can access your information!













Enter: Certificate Authorities

 Publishing your Public Keys enables users to validate that information truly comes from YOU • Certificate Authorities ("CA"s) exist to provide another layer of security to prove identity





bank.priv



- They "sign"/certify that a given public key is authentic





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- CAs can be chained ("Chain of Trust")












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CA Signed Certificate

How to Prove Identity





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CA Signed Certificate

How to Prove Identity



Applying to Confidential Computing



- liability-prone reasons
- These users are reluctant to utilize CSPs for the above reasons They don't or can't trust the Technicians



Users Have Sensitive Data Increased Liability for the Developer, GPU Operator, etc.

Developers and users have sensitive data. This may be due to privacy-based regulatory requirements, trade secrets, or other

• CPU vendors (Intel, AMD) have already begun providing confidential modes to prevent unauthorized access to data-in-use





AMD SEV-SNP TEE

How AMD Handles Trusted Execution Environments





Intel TDX

How Intel Handles Trusted Execution Environments



- The CPU solutions are currently insufficient for PCIe based accelerators
- Hopper Confidential Computing extends the trust boundary to the GPU Requires hardware based Trusted Execution Environment (TEE)
- Prevents physical bus-snooping, or Hypervisor access to GPU



Users Have Sensitive Data Increased Liability for the Developer, GPU Operator, etc.



Confidential Computing with Hopper H100



NVIDIA Hardware Roadmap to Confidential Computing







A40/A10/A2

Secure Boot (all firmware auth'ed) HW fault injection countermeasures SR-IOV

H100

Confidential **Compute Capable On-Die RoT** Measured/Attested Boot FIPS 140-3 Level 2

2021

2022



Mapping Core Use Cases to Hopper-CC



Single GPU Passthrough

Non-virtual server with exclusive ownership of the GPU

Single Confidential GPU direct-attached to a single Trusted VM.

Inference, HPC, lightweight training.

Confidential Computing Roadmap



Multi-Instance GPU/MIG

Physical GPU is split into per-VM partitions

Confidential Computing for multiple tenants per GPU

Uses SR-IOV & vGPU: Microservice inference, edge aggregation HPC



Threats Addressed by Confidential Computing Protecting Data in Use from the owner of the Compute Infrastructure

In a cloud environment where users rent VM instances from a CSP, the following threats are mitigated: • Data and Code Confidentiality – protect all application code and data in the VM instance from being read by the host

• Data and Code Integrity - protect all application code and data in the VM instance from being altered by the host

• Physical Attacks with everyday tools – interposers on buses such as PCIe and DDR memory cannot leak data or code



Threat Category Use memory remapping to read tenant data Q Confidentiality Integrity Denial of Service to hypervisor by tenant Denial of Service to tenant by another tenant Permanent denial of service of GPU by tenant Availability Denial of Service to tenant by hypervisor General

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Threats & Mitigations

- Use PCIE/NVLINK to read tenant data (e.g. Hypervisor, another VM, PCIE interposer)
- Use Out-of-band management/debug channels to read tenant data (e.g. SMBus, JTAG)
- Use GPU Cache/Memory based side channels to read tenant data
- Use GPU TLB based side channels to read tenant data
- Use GPU Performance Counters to read tenant data or fingerprint tenant
- Read tenant data via hypothetical physical attacks (physical side channels / DPA / EM,
- Use PCIE/NVLINK to modify tenant data (e.g. Hypervisor, another VM, PCIE interposer)
- Use Out-of-band management/debug channels to modify tenant data (e.g. SMBus, JTA)
- Corrupt tenant data by replaying previous data or MMIO transactions (replay attacks)
- Corrupt tenant data via hypothetical physical attacks (fault injection, HBM interposer)
- Use a spoofed, non-genuine, or known vulnerable TCB component
- Use hardware side channels (e.g. DPA) to extract persistent device keys
- Use hardware side channels (e.g. DPA) to extract tenant ephemeral session key

	Mitigation	
	\checkmark	
)	\checkmark	
		_
HBM interposer)	×	
r)	\checkmark	
(G)	\checkmark	
	X	_
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NVIDIA Confidential Computing Introduction Protecting Data and Code from Hypervisor and Physical Attacks

- Prerequisites:
 - CPU with support for a Virtualized-based TEE ("Confidential") VM")
 - Supported variants are AMD Milan or later, or Intel SPR and later.
- Capabilities:
 - Trusted Execution Environment Isolated environment providing confidentiality & integrity
 - Virtualization-based Applications can run unchanged and do not have to be partitioned
 - Secure Transfers High performance HW acceleration for encrypted CPU/GPU transfers
 - Hardware Root of Trust Authenticated firmware; measurement & attestation for the GPU



Legend	TEE	Access From Host





- VM-based TEE extended to protect entire workload:
 - NVIDIA drivers, libraries, APIs run in the VM
 - No application changes are needed to run in this mode
- Exclusive assignment to VM for each physical GPU:
 - VM may have multiple GPUs
- Isolation from host for confidentiality and integrity:
 - Encrypting the data over PCIE
 - Encryption transparent to applications

Secure Passthrough

Confidential Computing for Exclusive Assignment of a GPU to a VM





CC On Mode Initialization Sequence Mode enablement and session establishment



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Attestation: "I Am Who I Say I Am" Preventing a Spoofed GPU

Since all the local-attack surfaces are covered, how do we stop physically 'spoofing' a GPU? Attestation reports are generated with device-specific measurements, public/private key pairs, etc.



Confidential workloads

- by the GPU
- If anything does not match, it will fail

The Attestation Verifier Application How to Verify an Authentic GPU

An NVIDIA provided, open-source application, will be provided to developers to verify the GPU's readiness to accept

• The GPU, after initialization, will be ready to provide Evidence that it is authentic • Static and dynamic device measurements, firmware versions, driver microcode, signed/Endorsed by the device

• The Verifier application has a Reference set of measurements, which is used to compare to the Endorsed Evidence provided

• The Verifier application reviews and compares the Endorsed Evidence against the Reference measurements

• If all Endorsed Evidence matches expected Reference values, the Verifier will inform the developer the GPU is authentic

• Verifier will also return whether the GPU is in a Confidential Computing mode, or if it is in standard mode.







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vGPU with Confidential MIG provides multi-tenant CC:

- TEE = Secure GPU Instance + Confidential VM
- TEE isolated from hypervisor/host and other tenants
- Hypervisor/Host creates TEE instances but cannot access state

Feature is based on:

- NVIDIA vGPU enables multiple VMs sharing a single NVIDIA GPU
- Multi-Instance GPU (MIG) partitioning of GPU into instances
- SR-IOV PCIE devices expose VF for direct control by VM

Confidential MIG on vGPU Confidential Computing for a GPU partitioned across VMs



Example VM Topology - 1 GPU partitioned as 2 CMIGs





- This includes AI Training for most AI models with large batch sizes
- This includes AI Inference for large modes (BERT, Transformer, etc.)
- CC on CPU.
- Some CUDA APIs have different performance characteristics

Hopper CC Performance

Hopper Confidential Computing runs GPU side compute at full performance

• Applications with high compute vs data transfer will run at close to non-CC Hopper performance

• Al Inference on smaller models, e.g., Resnet50, will see slowdowns on Hopper CC, but would still be significantly faster than

• Execution control APIs (e.g. kernel launch, CPU side synchronization) can take longer under HCC Allocations made via cudaMallocHost/cudaHostAlloc may have increased access latencies • Data transfers via cudaMemcpy or cudaMallocManaged may have lower performance under HCC



Confidential Compute Security Standards

Overall

FIPS 140-3 Level 2

(All implementations of crypto operating on tenant data)

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Device Identity

Online Certificate Status Protocol/OCSP (Device Identity Certificate Revocation; NVIDIA managed)

X.509 (Device Identity Certificate)

ECC-384 (Device Private Key)

Session

DMTF Security Protocol and Data Model/SPDM (Key Exchange, Retrieve Device Attestation Report)

AES-GCM 256 (Confidentiality/Integrity of tenant traffic)

ECC-384 (Device Public/Private Key via SPDM)

SHA2-384 (Measurements, HKDF)

TCG Reference Integrity Manifest/RIM (Reference Measurements)





CUDA Considerations With Hopper Confidential Computing



CUDA Applications Will Run Unmodified

- be required
 - - Registering a host-pointer to the GPU will be blocked
- - This applies to inter-device peer-to-peer and multinode NVLink as well
- back on any corner-case code

• NVIDIA has worked hard to ensure that a transition to Confidential Computing mode is as transparent to our developers as possible.

• Due to the architecture of CPUs' Trusted Execution Environments, developers should be aware of a few areas where changes may • Host memory cannot be directly accessed by the GPU, as it is blocked by the CPU's IOMMU:

• CUDA stream batch MemOps targeting pinned CPU memory are not supported

• As the trust is built between the CPU and the GPU only, RDMA-based applications can't access either CPU or GPU memory directly Multi-device can still perform cudaMemcpyD2D for multi-GPU environments

• Good coding practices of checking for supported functionality of the GPU with simple guardrails should be sufficient to catch and fall-

Hopper H100 Confidential mode is primarily targeting compute acceleration





- Memory allocation done via cudaMallocManaged() will create a unified pointer that both GPU and CPU can access
- The driver handles all paging requirements, faults, code migration, etc.
- Creates incredibly easy developer experience

https://developer.nvidia.com/blog/unified-memory-in-cuda-6/ https://developer.nvidia.com/blog/unified-memory-cuda-beginners/

CUDA API Details

UVM: Optimized Memory Allocation Since CUDA 6.0









Unified Memory



- cudaMallocManaged() is fully supported in Confidential Computing Mode
- CUDA APIs for allocating pinned system memory work with Confidential Computing:
 - cudaHostAlloc() # runtime;
 - cuMemHostAlloc() #driver
 - cudaMallocHost() # runtime;
 - cuMemMallocHost () #driver
- CUDA APIs for accessing CPU allocated memory (e.g., with malloc or new) are not possible with Confidential Computing:
 - cudaHostRegister() # runtime;
 - cuMemHostRegister() #driver
 - These APIs are rarely used, and where used can easily be substituted with the CUDA allocation APIs

CUDA API Details





















Details on Other API considerations

<u>Unsupported APIs with CC=on</u>

- Confidential Computing on Hopper is Compute only
 - Graphics not supported
 - Therefore, compute-graphics interop APIs aren't supported
- These APIs cannot work due to the security protections of the CPU TEE:
 - cuMemHostRegister/cudaHostRegister
 - cuStreamBatchMemOp³
 - cuStreamWaitValue³
 - cuStreamWriteValue³

These APIs will Fall Back to UVM Based Calls

- cudaMallocHost -> cudaMallocManaged^{1,2}
- -> cudaMallocManaged^{1,2} cudaHostAlloc
- cudaFreeHost -> cudaFree

Changed, but supported APIs





Developer Tools Support

Tool

CC-Off – Standard H100 operation: No encryption, no bounce buffer

CC-On – All data/code is encrypted and authenticated. Firewalls preve

CC-DevTools – All data/code is encrypted and authenticated. Firewalls tool access to performance counters

cuda-gdb - a seamless debugging experience that allows you to debug

Nsight Visual Studio Code - application development environment for

Nsight Systems - System-wide performance analysis tool

Nsight Compute* - Interactive profiler for CUDA and NVIDIA OptiX

CUPTI* - CUDA Profiling Tools Interface

NVTX - NVIDIA Tools Extension

Memcheck—- The memory access error and leak detection tool

Racecheck - The shared memory data access hazard detection tool

Initcheck -The uninitialized device global memory access detection too

Synccheck - The thread synchronization hazard detection tool.

Support	Under	CC

ent outside access	X
s are dropped to enable	
g both the CPU and	
heterogeneous	
	X
ol.	\checkmark



NVIDIA Libraries Working in Confidential Computing Mode

Library	Working in Hop Confidential Con Mode?
cuFFT	Yes
cuSPARSE	Yes
cuSPARSELt	Yes
cuBLAS	Yes
cuBLASLt	Yes
nvBLAS	Yes
Math API	Yes
NPP	Yes
nvJPEG	Yes
nvJPEG2000	Yes
nvTIFF	Yes
cuRAND	Yes
cuTENSOR	Yes
cuTensorNet	Yes
cuStateVec	Yes
cuSOLVER	In Progress







