

THE NETWORKING IN THE 'AI' ERA

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Agenda

- 1. Who is Arista Networks?
- 2. Deep Learning Networking Requirements
- 3. Networking Requirements for Inter-GPU Traffic
- 4. Architectures for AI Network Fabrics
- 5. A Quick Glance to the Future of AI Ethernet
- 6. Conclusions





WHO IS ARISTA NETWORKS?

Introducing Arista Networks





Arista's Market Leadership in 100G/200G/400G



Data Center High Speed Ethernet Port Analysis

Source: Crehan Ethernet Switch Data Center Total Vendor Tables - 4Q'23



Introducing Arista Networks







Software Driven Cloud Networking



Consistent Engineering and Operations Across All Network Domains







DEEP LEARNING NETWORKING REQUIREMENTS

Machine Learning vs Deep Learning



	Machine Learning	Deep Learning	
# Input Values	Low	High	
Feature Extraction	Manual	Automatic	
Classification	Simple	Complex	
Output	Raw	Granular	
Data Exchanged	"Low"	Huge	



The Usual Suspects to Manage AI





Distributed Training a Complex Model





GPU to GPU Interconnect









NETWORKING REQUIREMENTS FOR INTER-GPU TRAFFIC

What's Different About AI Workloads?

- Al workloads are using "collective" communications for parallel computation
- Development frameworks are using RDMA approach to bypass kernel for more efficiency
- Main traffic characteristics:
 - Tight time synchronisation between bursty traffic flows
 - Small number of large sized flows (<10 per nic)
 - Very low level of entropy
 - Short periodic burst of network activity followed by high computation processes
- Highly susceptible to collision
- "Slowest" member drives performance!





Al training workload are highly coordinated and highly sensitive to delay variations



Networking for AI: What Do You Need?

• A fast, lossless network

- For many forms of communication

ALL-REDUCE, BROADCAST, ALL-TO-ALL

- Graceful handling of large/bursty synchronized flows
- Fast and reliable transfer from host to network (RDMA)

A network with consistent latency

- Tail latency (high percentile latency) is likely to impact job completion time significantly
- A network without collision
 - Distribute equally low-entropy flows along all physical paths
- Visibility and telemetry
 - To identify bottlenecks in the network or application



Al Workloads require a dedicated high performance lossless network



RDMA over Converged Ethernet (RoCE)

- Network protocol that allows RDMA over an Ethernet network
- The second version (RoCEv2) enhances the protocol with UDP/IP header
 - Operations on routed ethernet networks: ubiquitous in large datacenters
 - IP QoS: DSCP or alternatively COS/VLAN PRI Priority Flow Control (PFC)
 - IP congestion control: the Explicit Congestion Notification (ECN) signal

https://www.arista.com/assets/data/pdf/Broadcom-RoCE-Deployment-Guide.pdf

RoCEv2 enables Ethernet infrastructure to behave like a fast, quick and reliable lossless fabric



Flow Collision and Traffic Polarization





- Load balancing in IP routing is based on "ECMP"
 - Basically it is a Hash of fields in packet header (see next slide)
- But AI clusters don't drive a significant distribution of parameters
 - Low level of entropy
- Large flows could be polarized on the same links and produce unwanted side effects



How to Avoid Collision / Traffic polarization

- **ECMP hashing**: limited efficiency, especially with Ring (few flows with a lot of data)
- LB Numbered: LB Number assigned on each ingress interface so that all traffic arriving on a specific interface is effectively mapped to an egress interface between TOR & Spine (Stitching)
- Dynamic Load Balancing: Smart flow distribution based on link utilization
 - ECMP optimization available on selected Arista platforms
 - Flows are allocated to new links based on current utilization, significantly increasing hash performance/efficiency
 - Continuous reevaluation of best links with flows rebalancing
- Cell based fabric*: Capability to spray a flow among multiple links



* coming soon







ARCHITECTURES FOR AI NETWORK FABRICS

Building Blocks of a Typical GPU System



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Arista Platforms for AI Networking

7060DX5/6 - 7388X5

Low Latency, Fixed Systems, Single-chip



7388X5 - 64x 400G



7060DX5 - 64 x 400G / 32x 800G



7060DX6 - 64 x 800G

25.6/51.2 Tbps Systems

7800R3

High Density, VOQ, Multi-chips with optimal cell-based internal fabric



7800R Series 4 to 16 Slots

Up to 460.8Tbps Systems



Next Generation 7060X6-64PE Series

51.2T Throughput: 64 Ports 800G QSFP-DD800 or OSFP800



- Optimized for AI/ML workloads and Hyperscaler
- 51.2 Tbps System with a single chip
- 5nm Process Lower Power
- 165MB Buffer
- Consistent Tomahawk Architecture
- Comprehensive Instrumentation and Traffic Management



AI Fabric Architectures



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Single Tiered AI Fabric - 7060DX5

32 port 800G* (2x400G) OSFP or QSFP-DD



64 port 400G QSFP-DD

- Fixed Configuration Switch
 - 64x 400G
 - 32x 800G
- No flow collisions
 - Single-asic line-rate forwarding
- ECN and/or PFC to handle incasts
 - Low buffers Requires tuning
- Single-homed systems
- If a GPU fails, the whole job fails



Single Tiered AI Fabric - 7060DX6



Small AI applications Up to 128 xPUs at 400Gbps



7060DX6-64PE 64 port 800G (2x400G) OSFP

- Fixed Configuration Switch
 - 64x 800G
- No flow collisions
 - Single-asic line-rate forwarding
- ECN and/or PFC to handle incasts
 - Low buffers Requires tuning
- Single-homed systems
 - If a GPU fails, the whole job fails



Single Tiered AI Fabric - 7800R3





- **7800R3 Modular chassis offering high port density** 4, 8, 12 or 16 slots / 36x 400GbE Linecards
- Non-blocking distributed forwarding Leaf (Linecards) & Spine (Fabrics) in a single chassis
- No flow collisions between line card and fabric Scheduled Cell-based Fabric

Built in overprovisioning between line card and fabric 100% Fair and Efficient Load Balancing within the chassis



- **High Availability** Fabric, fan, power supply, sup redundancy
- ECN and/or PFC to handle incasts Deep buffers - Requires minimal tuning



Multi-Tiered AI Fabric



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Example: 8K GPU Cluster w/ 7060X6-64PE

Enterprise AI Focus

8192 GPUs is ~\$200M -> large enterprise cluster

- Cluster Details
 - 1024 node GPU cluster
 - 8x 400G NICs per chassis
 - 8192x 400G GPU host ports
- Design Details
 - 。 Leaf# 128
 - Spine# 64





Example: 64K GPU Cluster w/ 7800+7060X6



- 2 tiers of switches
- 64k 400G GPUs with 400G Leaf-Spine links
- 4032 racks

64 GPUs per Leaf 72k GPUs 64 GPUs 64 GPUs 64 GPUs 64 K GPUs

With 400G GPUs

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A QUICK GLANCE TO THE FUTURE OF AI ETHERNET

Ultra Ethernet Vision

Deliver an Ethernet based open, interoperable, high performance, full-communications stack architecture to meet the growing network demands for AI & HPC at scale



Source: https://ultraethernet.org/



UEC Summary

Mission: <u>IMPROVE</u> Ethernet for AI and HPC

- Started fall 2022, Arista joined Feb 2023
- Steering members: AMD. Arista, Broadcom, Cisco, Eviden, HPE, Intel, Meta, Microsoft, Oracle
- Public launch: July 19th 2023

AMDZ ARISTA OBROADCOM CISCO







UEC Deliverables

- July 19th '23 Website and white-paper outlining the problem and the plan
- November '23 Specifications
- Key Specifications is a transport protocol that:
 - enables packet spraying network for high utilization
 - supports out-of-order packet delivery
 - provides efficient **congestion control**





UEC Deliverables - cont'd

- March '24 Specifications
- UEC progresses towards v1.0 Set of Specifications
 - UEC Stack
 - Multi-path packet spraying
 - Flexible ordering
 - "State of the art", easily configured congestion control mechanisms
 - End-to-end telemetry
 - Multiple transport delivery services
 - Switch offload (i.e., In-Network Collectives)
 - Security as a first-class citizen co-designed with the transport
 - Ethernet Link and Physical layer enhancements (optional)



UEC Transport - Key Properties

- Scales to 1,000,000 Nodes
- Packet-Level multi-pathing for very high network utilization
- AI-Optimized, configuration-free congestion control
 - Incast Management to address fan-in at the last hop
 - **Rate Control** to ramp quickly to wire rate without impacting existing flows
- Support for out-of-order packet delivery with in-order messaging completion
- Low tail latency

Highest infrastructure utilization at ultra high scale, without tuning



RDMA Network Technologies Comparison

Feature	InfiniBand	Ethernet/RoCEv2	Ultra Ethernet
Primary RDMA Interface	IB Verbs	IB Verbs	libfabric
Scalable Control Plane			
Multi-Path Packet Spraying		•	
Flow Control	Credit-based	PFC/ECN	Dynamic Multi-path
Scheduled Fabric		•	
E2E Drop Recovery	•	•	
Transport Encryption			
Multi-Vendor Ecosystem			



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CONCLUSIONS

Takeaways

- No Multihoming if one GPU job fails they all fail
- GPUs are explotentailly more expensive than the switch
 - Do not make savings on the network
- Traffic is very spiky, 0 to 400G in milliseconds, then back again
 - Real time observability
- Packet delivery and load balancing (elephant flows) are critical:
 - Any data loss, job may have to start again expensive
 - Any slow down, the entire job slows down expensive
 - Dynamic Load Balancing or cell forwarding
 - DCB/RoCEv2 for packet delivery



Pillars to run a HPC/AI netowrk



https://www.arista.com/en/solutions/ai-networking







Thank You

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