



# **Optimizing Training Performance** for LLM in Kubernetes

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#### Who We Are



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### What's Batch System?



## A distributed system helps us to manage the workload to match the design performance of hardware.

- Computing resources, e.g., CPU, GPU, DPU and other accelerators
- Networking resources, e.g., Eth/IB/RoCE, bandwidth, health, latency
- Storage resources, e.g., cache, local disk, remote/distributed storage



# Cloud native batch scheduling system for compute-intensive workloads

- Computing resources: DRF, fair-sharing, Queue, SLA, backfill, preempting, reclaiming, ....

  We're here now!
- Networking resources, e.g., Task-Topology Scheduling, Networking Topology Aware Scheduling
- Storage resources, e.g., Data aware scheduling, Data pre-loading

#### **Volcano Plugin Machinery**

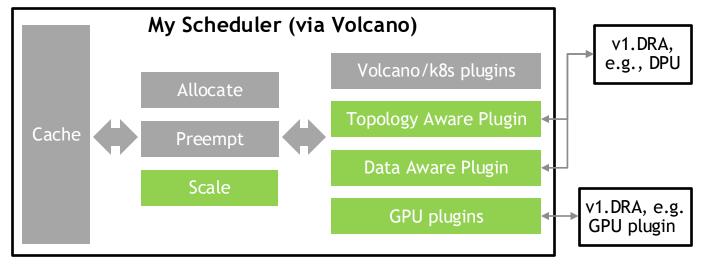












```
main
     "volcano.sh/volcano/cmd/scheduler/app"
       "volcano.sh/volcano/pkg/scheduler/actions"
       "volcano.sh/volcano/pkg/scheduler/plugins"
11
13
       "xxx.com/my-scheduler/pkg/volcano/actions"
       "xxx.com/my-scheduler/pkg/volcano/plugins"
15
16
   func main() {
18
     if err := app.Run(s); err != nil {
20
       fmt.Fprintf(os.Stderr, "%v\n", err)
21
       os.Exit(1)
22
```

#### **LLM Training meets Volcano**



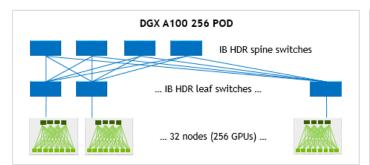
#### Challenges

- High GPU density
- High Bandwidth & Low latency

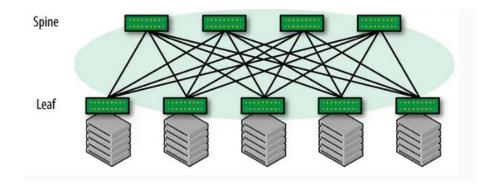
#### Volcano

- Computing resources: DRF, fair-sharing, Queue, SLA, backfill, preempting, reclaiming, ....
- Networking resources, e.g., Task-Topology Scheduling, Networking Topology Aware Scheduling
- Storage resources, e.g., Data aware scheduling, Data pre-loading

#### **Backgrounds of Networking Aware Scheduling**







**NVIDIA Super Pod** 

DIY Spine-leaf Network

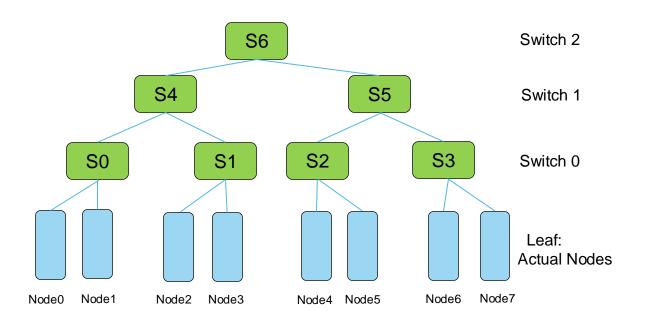
- Heterogeneous Data Center Network Architectures
   Protocol and Topology Diversity from IB to RoCE, NvLink
- Inter-Node Communication in Multi-Tier Networks
   Performance Varies Across Network Hops

- Affinity Scheduling for Compute-Intensive Workloads:
   Affinity scheduling optimizes placement for topology-sensitive workloads,
   e.g. model parallelism, disaggregated storage/compute
- Topology-Agnostic Scheduling:
   The Hidden Cost of Generic Schedulers

#### **Network Topology Aware Scheduling**



#### HyperNode: Standardizing Cluster Topologies via Performance Domains



- •Leaf HyperNodes (s0, s1, s2, s3): Whose members are actual cluster nodes.
- •Non-Leaf HyperNodes (s4, s5, s6): Represent other HyperNodes.
- •node0 and node1 within s0 have the highest communication efficiency.
- •node1 and node2 spanning two HyperNode layers (s0→s4→s1) have lower efficiency.
- •node0 and node4 spanning three HyperNode layers (s0→s4→s6) have the lowest efficiency.

Feature Preview in v1.11.0-network-topology-preview.0

#### HyperNode example

```
apiVersion: topology.volcano.sh/v1alpha1
kind: HyperNode
metadata:
name: s0
spec:
tier: 1
members:
- type: Node
selector:
regexMatch:
pattern: node-[01]
```

```
apiVersion:topology.volcano.sh/v1alpha1
kind: HyperNode
metadata:
    name: s6
spec:
    tier: 3
    members:
    - type: HyperNode
    selector:
    exactMatch:
    name: s4
```

#### Volcano Job with network Topology

```
spec:
networkTopology:
mode: hard
highestTierAllowed: 2
```

## Pipelines for Networking scheduling



- Unified API for NvLink/IB/RoCE via Restful API and OpenAPI
- Device or Service auto-discovery, e.g., Nvidia DPF (HBN/OVN for networking, SNAP for storage)
- Topology/Healthy auto-discovery
- Bandwidth/Latency auto-discovery

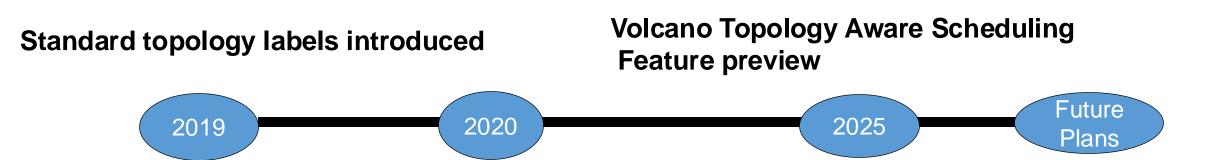
```
apiVersion:topology.volcano.sh/v1alpha1
kind: HyperNode
metadata:
name: s6
spec:
tier: 3
members:
- type: HyperNode
selector:
exactMatch:
name: s4
```



```
apiVersion:topology.volcano.sh/v1alpha1
kind: HyperNode
metadata:
 name: s6
spec
 tier: 3
 members:
 type: HyperNode
  selector:
   exactMatch
    name: s4
status:
  conditions:
    type: Ready
    value: true
    timestamp: 2025-03-01 1:11:11
```

## Evolution of Network Topology Awareness in Kubernetes





PodTopologSpread feature released

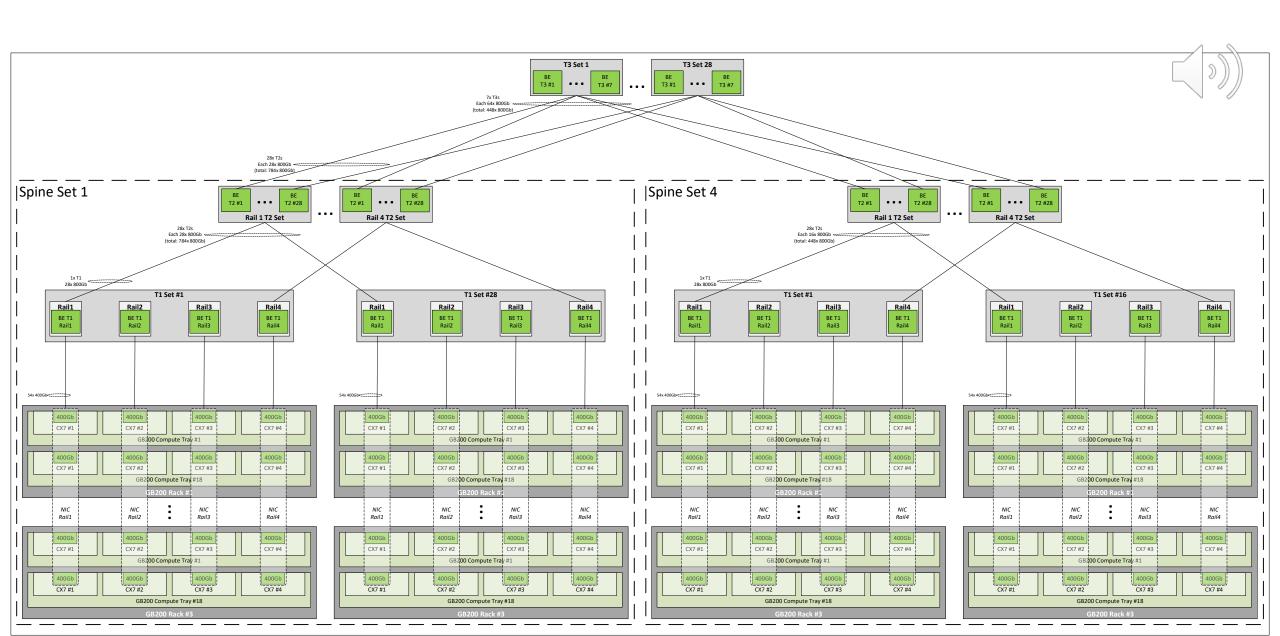
### Why we choose Volcano Scheduler



- Gang Scheduling
- Heterogeneous Device Scheduling
- Task Topology Support
- Flexible Resource Sharing/Preemption/Reclaim

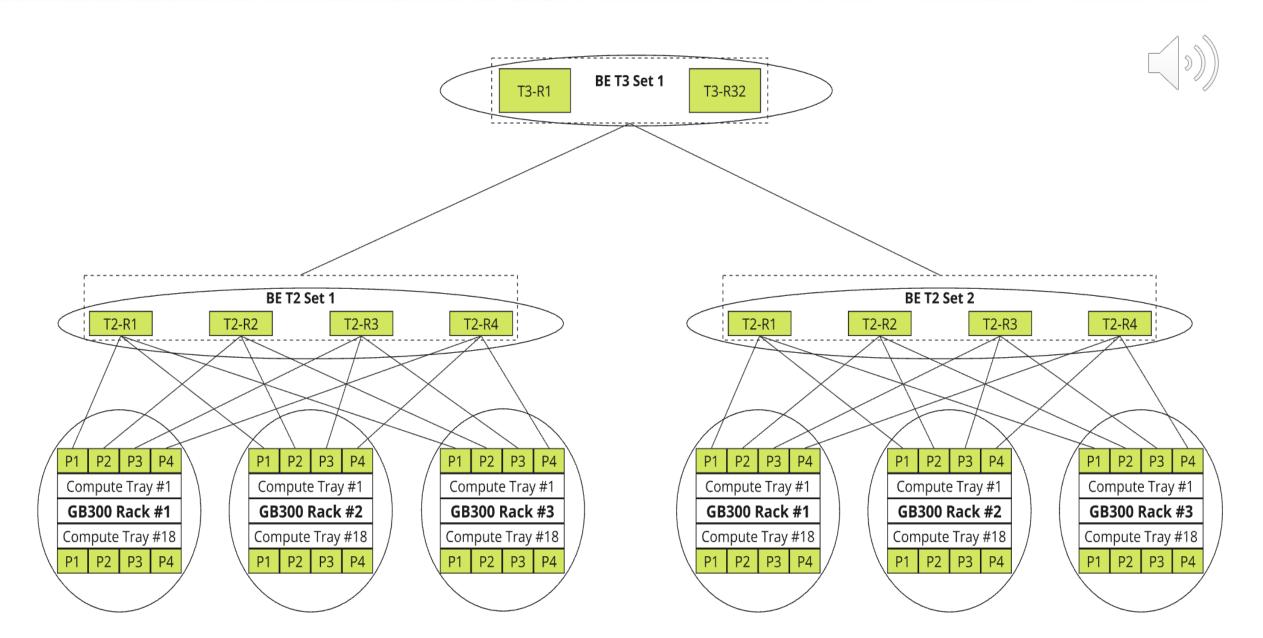
### A Typical GB300 Cluster Backend Network Topology





#### Logical HyperNode Topology





#### **Demo Setup – Software Versions**



**K8s:** v1.32.2

Kind: v0.27.0

KWOK: v0.6.1

Volcano: v1.11.0-network-topology-preview.0

# DEMO

#### **Demo Summary**



**Cluster Topology** 

**Job Submission** 

**Scheduling Observation** 

## How to Enable Network Topology-Aware Scheduling



- 1. **Install Volcano v1.11.0 or later**: This version includes the Network Topology-Aware Scheduling feature.
- 2. **Define HyperNodes**: Create HyperNode CRs to represent your cluster's network topology.
- 3. Configure Jobs with Network Topology Constraints: Specify the desired network topology constraints in your job definitions to guide the scheduler's placement decisions.

#### **Volcano Installation**



helm install volcano volcano-sh/volcano \
--version v1.11.0-network-topology-preview.0 -n volcano-system --create-namespace

#### HyperNode CRD Example



```
conf > hypernode > ! hypernode.yaml > ...
       # HyperNode Custom Resources for Network Topology
       # Tier 1: Rack level HyperNodes
       apiVersion: topology.volcano.sh/v1alpha1
       kind: HyperNode
       metadata:
         name: rack-uk-london1-dc01-row01-rack01
       spec:
         tier: 1
 10
         members:
         - type: Node
 12
           selector:
 13
             regexMatch:
 14
               pattern: "gb300-node-uk-london1-dc01-row01-rack01-node[0-9]+"
 15
```

#### Job YAML Example



```
conf > jobs > ! Ilm-training-1.yaml > { } spec > { } networkTopology
       apiVersion: batch.volcano.sh/v1alpha1
       kind: Job
       metadata:
  4
         name: llm-training-1
       spec:
  6
         networkTopology:
           mode: hard
  8
           highestTierAllowed: 1
  9
         minAvailable: 18
         schedulerName: volcano
 10
```

#### **Challenges and Limitations**



- External Network Topology Discovery: Volcano does not include an in-band network topology discovery service. Each cloud provider or cluster administrator needs to implement their own method for defining and maintaining the network topology information.
- Accuracy of Topology Information: The effectiveness of scheduling depends on the accuracy of the HyperNode definitions.
- Dynamic Cluster Environments: In rapidly changing clusters, maintaining up-to-date topology information can be challenging.
- Still in Early Preview: This feature will mature overtime, but today it is still in Preview stage.

#### **Future Directions and Call for Actions**



- Add External Network Topology Discovery: For cloud providers, to add cloud provider specific network auto discovery features.
- Network Topology Aware Scheduling in Production: We plan to upgrade to the latest Volcano version when this feature reaches GA.
- Scheduler Performance Tuning/Validation: We did not get a chance to test the performance of the scheduler as of today. We plan to do a scheduling performance analysis and workload performance analysis as well.

#### **Keep in Touch**



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## Thank you



Q&A