



Slinky: Slurm in Kubernetes Performant AI and HPC Workload Management

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Slinky: Slurm in Kubernetes

Performant AI and HPC Workload Management

slinky

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Introduction

What is Slurm?

- Leading HPC Workload Manager
 - Workload Manager = Scheduler + Resource Manager
 - Roughly equivalent to "Orchestrator"
 - Scheduler:
 - Prioritize and decide which jobs to run on which parts of the system
 - Resource Manager:
 - Track node state and resources
 - Launch jobs
- Manages the majority of the TOP500 supercomputers
 - Also manages most Al/ML training workloads
 - Scales beyond 15,000 nodes in the cluster
- Open-Source
 - o GPL-v2+





Who are SchedMD?

- Developers of Slurm and Slinky
- Spun off from LLNL in 2012 to support Slurm's rapid adoption
 - Founders are Moe and Danny, the "MD" in SchedMD
- SchedMD provides commercial support for Slurm, alongside
 - Training
 - Consultation
 - Custom Development





slum + w = slinky



- Toolkit of projects to integrate Slurm into Kubernetes
- Open Source
 - Apache-2.0
- Three major components:
 - Slurm-operator
 - Slurm-bridge
 - Associated tooling





- Slurm-operator
 - Kubernetes Operator for managing Slurm clusters
 - Manage Slurm compute nodes through Kubernetes pods
 - Autoscale in response to Slurm system load
 - Released in November 2024
 - v0.1.0 November 2024
 - v0.2.0 March 2025
 - v0.3.0 June 2025



- Slurm-bridge
 - Kubernetes Scheduling Plugin
 - Enable Slurm scheduling of both Kubernetes Pods and Slurm Jobs on converged clusters
 - Will be released in June 2025
 - Will depend on Slurm 25.05 release (May 2025)
 - In early access with SchedMD customers now



- Associated Tooling
 - Slurm Client
 - Golang Client Library for Slurm's REST API
 - Slurm Exporter
 - Prometheus Exporter for Slurm's REST API
 - Metrics to enable autoscaling
 - Helm Charts
 - Container Images



Slinky Repositories



https://github.com/SlinkyProject



Cloud Native, HPC, and Slurm

a.k.a, "Why is an HPC scheduling guy even here presenting?"

Disclaimer

- Following slides are gross oversimplification of two complex and intertwined communities
- For every point I make there are multiple counter-examples
- Meant to provide broad context, at the expense of some degree of fidelity



HPC versus Cloud Native

- Different assumptions from the HPC and Cloud Native communities have driven different solutions in the workload scheduling space
- Slinky sits at the intersection of the two realms
- At a very high level, the perspectives can be summarized as:
 - HPC assumes **finite** resources, **infinite** workload demand
 - Cloud native assumes **infinite** resources, **finite** workload demand



"HPC assumes finite resources, infinite workload demand"

- Researchers have seemingly endless simulation work
- Systems cannot simultaneously execute all outstanding jobs
- Queue prioritization is paramount
 - Results in complex priority schemes
 - Granular limits on resource usage
- Largest simulations are presumed to need large collections of GPUs, CPUs, and nodes
- Jobs have time limits
 - Critical and easily overlooked aspect for efficiently anticipating future system use
 - "Backfill" scheduling ensures large jobs aren't permanently deferred
- Support for multi-node jobs up to thousands of nodes are a core component
 - HPC systems call these... "jobs"
- Systems are more statically defined
 - "Cloud bursting" or other auto-scaling methods have been retrofitted into the designs



"Cloud native assumes infinite resources, finite workload demand"

- Cloud orchestration Kubernetes was designed for micro-services
- All pods presumed expected to be running simultaneously to meet current service demands
- Scale horizontally by running additional pods and load-balancing between them
 - Tightly-coupled processes across multiple nodes are not a core design goal
 - Multi-node jobs are "gang scheduled"
 - Not natively supported require scheduler extensions to manage
- Pods run indefinitely
 - Until external load monitoring determines they should be terminated
- Capacity issues are managed by requesting additional resources
 - Support for queuing work not an explicit design goal
- Support for application resilience and dynamic resource management are presumed
 - Drives different scheduling semantics affinity / anti-affinity than HPC



Why converge the two?

- Systems faced with increasing demand for batch-style workloads
- AI/ML folks are running Kubernetes for Inference
 - But Slurm for Training workloads
- More traditional HPC systems are being asked to support more flexible workloads
 - But still need resource constraints, efficient queueing, and enough policy control to manage finite system resources
- Running and maintaining both traditional HPC and Cloud Native clusters simultaneously wastes resources
- How can we start to converge the two environments?
- Slinky exists at intersection of the HPC and Cloud Native environments
 - Slurm Operator provides for a traditional HPC environment within an overarching Kubernetes system
 - Slurm Bridge provides for HPC scheduling semantics for both traditional Slurm batch jobs and emerging cloud-native workloads
 - And gives systems engineers a central place to prioritize both



Additional Capabilities

- Slurm can provide scheduling advantages for pure-Kubernetes environments
 - Efficient multi-node scheduling and resource allocation
 - Planning around future system state "backfill" allowing deferred execution of multi-node workloads while not blocking current jobs from scheduling
 - Network topology management e.g., for NVLink interconnects ensuring optimal placement for multi-node workloads
 - And ensuring de-fragmentation



Slurm Operator

Slurm Operator Use Cases

- Manage Slurm clusters within a Kubernetes environment
- Each compute node maps to a Kubernetes pods running the slurmd process
- Support autoscaling based on cluster utilization metrics
- Run Slurm jobs natively
 - Users interact with Slurm through traditional CLI tools
 - Through one or more "login node" pods they can SSH into
- Kubernetes is not involved in scheduling or managing compute jobs
 - Slurm runs Slurm workloads directly
 - Allows for fine-grained resource limits
 - Backfill scheduling
 - Respect network topology especially for NVIDIA NVL interconnects
 - Allow large training workloads to run efficiently
 - Provide access to traditional HPC tooling such as PMI/PMIx

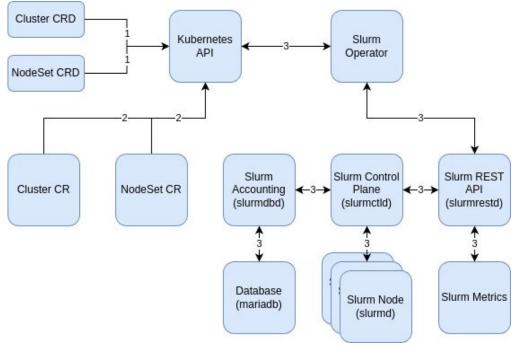


Documentation

• Initial documentation – <u>https://slinky.schedmd.com/</u>



Big Picture



- 1. Install Slinky Custom Resource Definitions (CRDs)
- 2. Add/Delete/Update Slinky Custom Resource (CR)
- 3. Network Communication

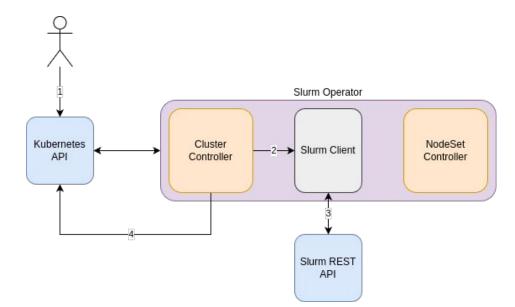
Custom Resources

- Cluster CR
 - Represents a Slurm cluster, by Slurm REST API (slurmrestd)
 - Define server URL and JWT auth token secret
 - Reconciles to internal Slurm client
- NodeSet CR
 - Represents a set of Slurm nodes (slurmd)
 - Define pod spec, Slurm specific options
 - Reconciles to Kubernetes pods



Slurm Operator – Cluster Client

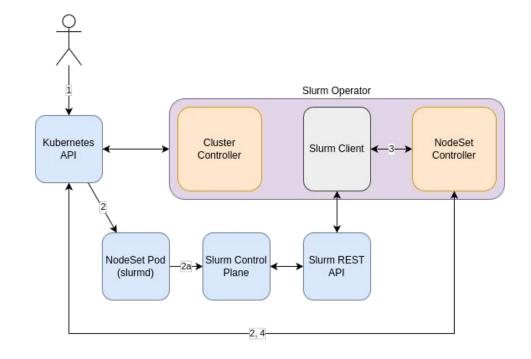
- 1. User installs a Cluster CR
- 2. Cluster Controller creates Slurm Client from Cluster CR
- 3. Slurm Client polls Slurm resources (e.g. Nodes, Jobs)
- 4. Update Cluster CR Status





Slurm Operator – NodeSet Scale-Out

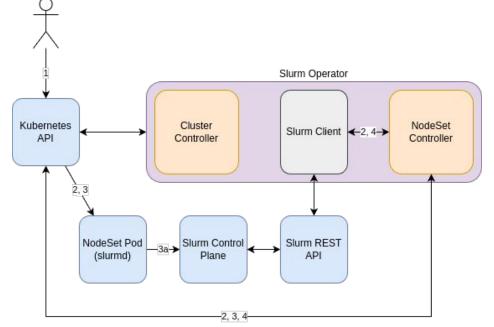
- 1. User installs NodeSet CR
- 2. NodeSet Controller creates NodeSet Pods from NodeSet CR pod spec
 - a. On process startup: the slurmd registers to slurmctld
- 3. Update NodeSet CR Status
 - a. Kubernetes NodeSet Pod Status
 - b. Slurm Node Status





Slurm Operator – NodeSet Scale-In

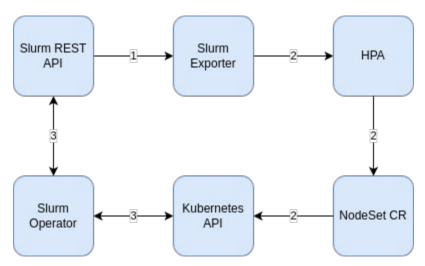
- 1. User updates NodeSet CR replicas
- 2. NodeSet Controller cordons NodeSet pod scale-in candidates:
 - a. Candidates are determined based on Slurm node and job information
 - b. Cordoned pods will be drained in Slurm, in preparation for safe termination and deletion
- 3. NodeSet Controller terminates NodeSet pod after fully draining a candidate
 - a. On pod preStop: Slurm node deletes itself from Slurm
- 4. Update NodeSet CR Status
 - a. Kubernetes NodeSet Pod Status
 - b. Slurm Node Status





NodeSet Auto-Scale

- 1. Metrics are collected and exported
- 2. Horizontal Pod Autoscaler (HPA) scales NodeSet CR replicas, based on:
 - a. Current metrics data
 - b. User defined scaling policy
- 3. The Slurm Operator reconciles the adjusted NodeSet CR replicas value:
 - a. Scale-in (replicas reduced)
 - b. Scale-out (replicas increased)



Slurm Operator Demo Screenshots Every 1.0s: kubectl exec

kubectl exec -n slurm statefulset/slurm-controller -- squeue; echo;

kubectl... bluemachine: Mon Jul 29 19:19:24 2024

OBID	PARTITION	NAME	USER S	ST	TIME	NODES	NODELIST(REASON)
221	purple	wrap	slurm F	PD.	0:00	2	(Resources)
224	purple	wrap	slurm F	PD	0:00	2	(Resources)
226	purple	wrap	slurm F	PD	0:00	2	(Resources)
227	purple	wrap	slurm P	2D	0:00	2	(Resources)
229	purple	wrap	slurm F	PD	0:00	2	(Resources)
231	purple	wrap	slurm P	2D	0:00	2	(Resources)
232	purple	wrap	slurm P	PD	0:00	2	(Resources)
234	purple	wrap	slurm F	D	0:00	2	(Resources)
235	purple	wrap	slurm P	PD	0:00	1	(Resources)
236	purple	wrap	slurm P	PD	0:00	2	(Resources)
237	purple	wrap	slurm P	PD	0:00	2	(Resources)
238	purple	wrap	slurm P	PD	0:00	1	(Resources)
216	purple	wrap	slurm	R	0:38	2	kind-worker,kind-worker2

PARTITION AVAIL TIMELIMIT NODES STATE NODELIST

infinite

purple* up

2 alloc kind-worker,kind-worker2

NAME	READY	STATUS	RESTARTS	AGE	IP	NODE	NOMINATED NODE	READINESS GATES
slurm-compute-purple-55gch	1/1	Running	0	4d	10.244.2.11	kind-worker2	<none></none>	<none></none>
slurm-compute-purple-xgdnb	1/1	Running	5 (3d23h ago)	4d	10.244.1.9	kind-worker	<none></none>	<none></none>
slurm-controller-0	2/2	Running	0	4d	10.244.2.12	kind-worker2	<none></none>	<none></none>
slurm-metrics-79c86f5978-s5wdv	1/1	Running	0	4d	10.244.2.9	kind-worker2	<none></none>	<none></none>
slurm-restapi-79f44bff7d-9pmqr	1/1	Running	0	4d	10.244.1.7	kind-worker	<none></none>	<none></none>







Slurm Bridge

Why Slurm Bridge

- Kubernetes lacks fine-grained control of native resources (CPU, Memory)
 - HPC and AI training workloads are generally more efficient when dedicated resources are assigned
 - Avoid jitter and cache contention
- Ability to have fast scheduling that is not possible in kubelet
- Ability to use both Kubernetes and Slurm workloads on the same set of nodes
 - Allow researchers to use their preferred tooling, without needing separate dedicated compute systems



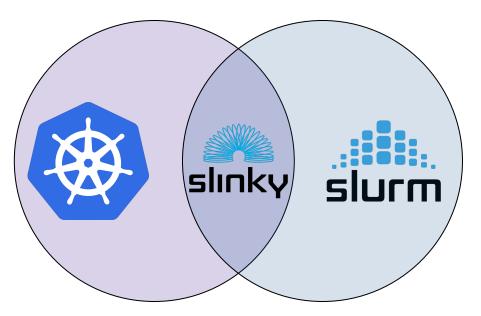
Why Not Slurm Bridge

- Slurm Bridge is not meant to replace the default scheduler
 - Another alternative
 - Kubernetes API makes it possible to provision multiple schedulers
 - Same approach taken by Kueue, Volcano, MPI Operator, ...
 - However... as the Kubernetes API doesn't provide a clean way to sub-divide resources within a node, it does assume that - for any node it's meant to schedule that is is the only workload scheduler
 - Disregard core infrastructure such as daemon sets that are still scheduled through the default scheduler
- Slurm Bridge may not be appropriate for your system
 - Intended for clusters that are predominantly dedicated to batch-oriented process
 - Or closely related domains such as AI/ML interference
 - Especially for managing multi-node inference workloads



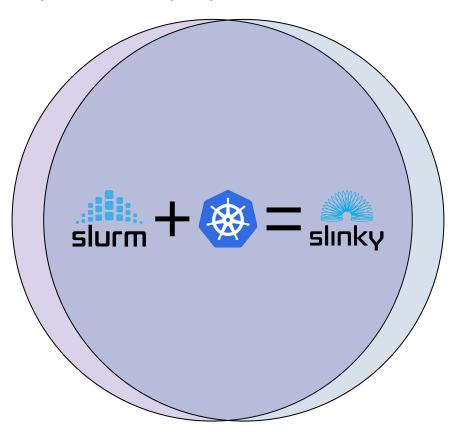
Domain Pools

- Kubernetes manages its nodes
 - Running kubelet
- Slurm manages its nodes
 - Running slurmd
- The Slurm-Bridge manages workloads running on converged nodes shared by both
- Nodes are not required to run both, but for most deployments they likely will





Domain Pools - Expected Deployment Pattern





Design Goals

- Run both Slurm and Kubernetes workloads on pools of nodes
- Slurm bridge will translate resource requirements for Kubernetes workloads into Slurm jobs
 - Reconstruct multi-node workloads, and submit single job to Slurm
 - PodGroup and JobSet currently
 - Likely LeaderWorkerSet as well
- Handle Device Plugins, such as GPUs
- Filter out nodes that Slurm is not to manage, through the current set of labels provided
- Filter out pods out via designated namespaces
 - Will have an allow-list of namespaces we handle
 - "slurm-bridge" in our demo



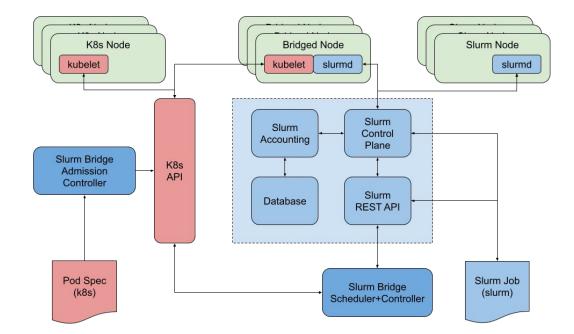
Restrictions

- Each node can run Slurm **or** Kubernetes workloads, not both concurrently
 - The kubelet will manage Kubernetes pods
 - The slurmd will manage Slurm jobs
- Configure the Slurm-bridge plugin as Kubernetes scheduling profile
 - Plugin will take control of all workloads in allow-list of namespaces
 - The Default Scheduler will handle all other workloads
- Slurm can only schedule to nodes with slurmd running
 - Even if you don't want to run native Slurm workloads
 - Need detailed CPU information that the Kubernetes API doesn't provide
 - Can use the Slurm Operator to manage these slurmd processes
 - Or run slurmd directly on base-metal



Big Picture

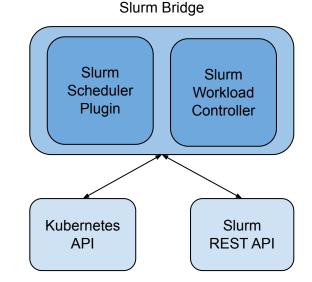
- Slurm-Bridge represents k8s pod(s) as a Slurm job, for scheduling purposes
- Kubernetes handles pods launch, after scheduling
- Slurm handles job scheduling
- Both Slurm and Kubernetes can still schedule other workload on non-Bridged Nodes





Slurm Bridge Scheduler + Controller

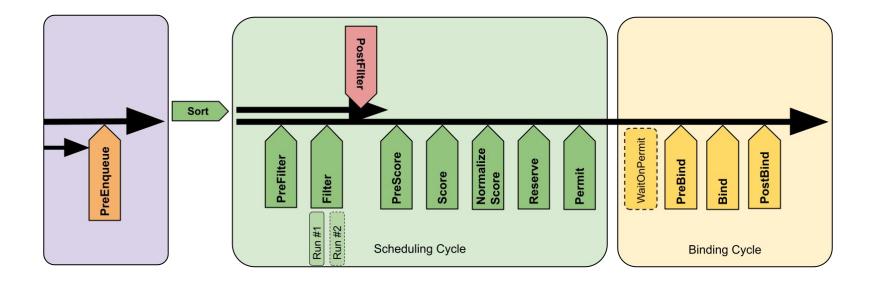
- Responsible for managing Slurm as the source of truth and enforcing scheduling decisions from Slurm
- Slurm Scheduler Plugin
 - Hooks into the Kubernetes scheduling API to utilize the Slurm Control Plane to make scheduling decisions
- Slurm Workload Controller
 - Reconciles pod drift/desync using Slurm as the source-of-truth for Slurm scheduled workloads





Slurm Bridge Kubernetes Scheduler Plugin

Kubernetes Scheduler Framework

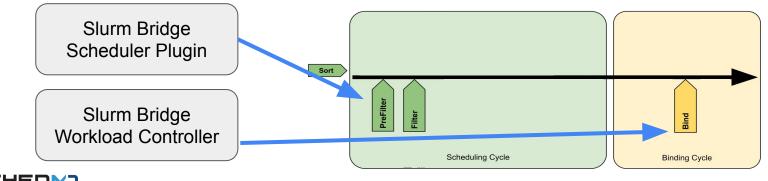




Slurm Scheduler Plugin

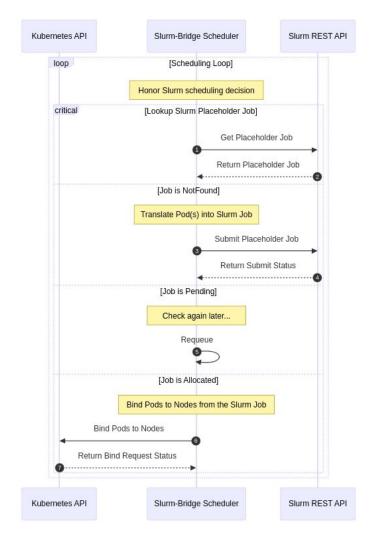
slurm + 🛞 =

- Only implement PreFilter/Filter and Bind
- PreFilter to capture new pod requests
 - To translate Pod into Slurm job and submit into Slurm's queues
- Bind to communicate the node allocation back to Kubernetes
 - Technically managed by the workload controller, not the scheduler plugin
- Does not implement all Kubernetes scheduling primitives
 - E.g., affinity/anti-affinity aren't available
 - Avoids some performance pitfalls of the Kubernetes scheduling API



Slurm Scheduler Plugin - Sequence

- Translate a pod spec to Slurm job spec
- Submit this "placeholder" job to Slurm
- Wait for placeholder job to start
- Bind the pod to allocated node

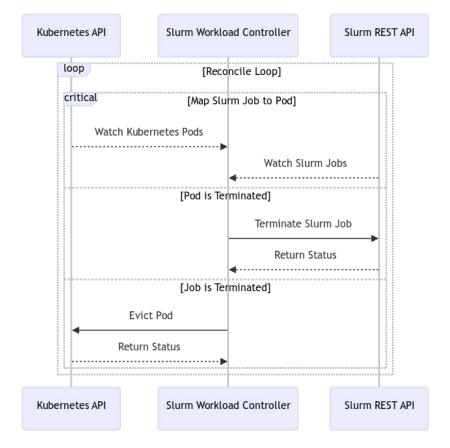


Slurm Bridge Workload Controller

Slurm Workload Controller - Sequence

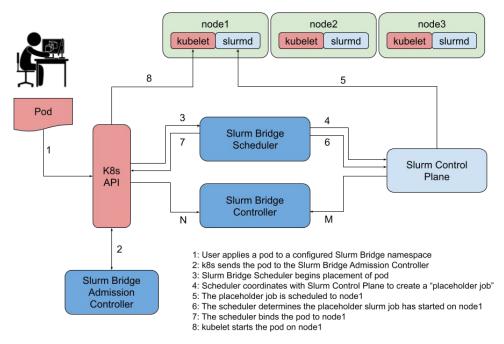
- Workload controller reconciles state between Kubernetes and Slurm control planes
 - Also issues Bind() calls against the pod once the placeholder Slurm job starts
- Slurm is the source-of-truth for Bridged Nodes
- Responsible for cleaning up:
 - Slurm jobs after pods complete/terminate
 - Pods after Slurm job complete/terminate

surm + 🛞 = 🌨 SCHEDMJ



Slurm Bridge User's Perspective

Slurm Bridge - User's Perspective



N: Slurm Bridge Controller reconciles k8s node and pod events M: Slurm Bridge Controller reconciles Slurm node and job events



Slurm Bridge Demo Screenshots

```
apiVersion: v1
kind: Pod
metadata:
  name: pause-pod
  namespace: slurm-bridge
  annotations:
    slinky.slurm.net/job-name: "pausepod"
spec:
  containers:
    - name: pause-pod
      image: registry.k8s.io/pause:3.6
<u>$ kubectl</u> apply -f pause-pod.yaml.debug
pod/pause-pod created
$ squeue
                                 NAME
             JOBID PARTITION
                                          USER ST
                                                        TIME NODES NODELIST(REASON)
                                                                   1 slurm-bridge-1
                16 slurm-bri pausepod
                                                         0:11
                                         slurm R
$ kubect1 get pods -o wide -n slurm-bridge
NAMF
            READY
                    STATUS
                              RESTARTS
                                         AGE
                                               IΡ
                                                              NODE
                                                                               NOMINATED NODE
                                                                                                 READINESS GATES
                                               10.244.2.12
                                                              slurm-bridge-1
pause-pod
            1/1
                    Running
                              0
                                         17s
                                                                               <none>
                                                                                                 <none>
```



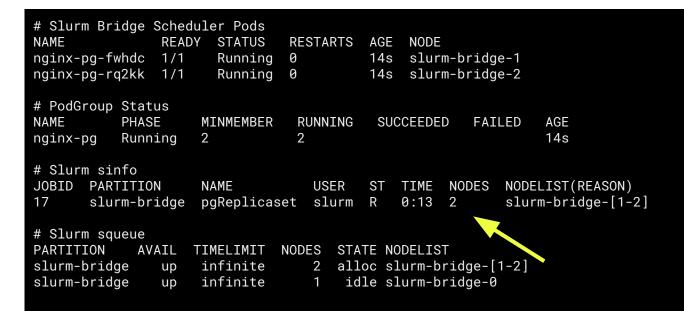
```
apiVersion: v1
kind: Pod
metadata:
  annotations:
    kubectl.kubernetes.io/last-applied-configuration: ...
    slinky.slurm.net/job-name: pausepod
    slinky.slurm.net/slurm-node: slurm-bridge-1
  creationTimestamp: "2025-03-26T12:38:17Z"
  finalizers:
  - scheduler.slurm.net/finalizer
  labels:
    scheduler.slinky.slurm.net/slurm-jobid: "16" <
  name: pause-pod
  namespace: slurm-bridge
  • • •
spec:
  containers:
  . . .
  schedulerName: slurm-bridge-scheduler
  tolerations:
    key: slinky.slurm.net/managed-node
    operator: Equal
    value: slurm-bridge-scheduler
```



slurm-node annotation allows for flexible mapping between Slurm and Kubernetes names. Here they're equivalent. Note the corresponding slurm-jobid label which is used to track status of the placeholder job.

```
apiVersion: scheduling.x-k8s.io/v1alpha1
kind: PodGroup
metadata:
   name: nginx-pg
namespace: slurm-bridge
   annotations:
        slinky.slurm.net/job-name: pgReplicaset
 spec:
   minMember: 2
 apiVersion: apps/v1
 kind: ReplicaSet
metadata:
   name: nginx-pg
namespace: slurm-bridge
   labels:
app: nginx-pg
spec:
   replicas: 2
   selector:
     matchLabels:
   app: nginx-pg
template:
      metadata:
        name: nginx-pg
namespace: slurm-bridge
        labels:
          app: nginx-pg
scheduling.x-k8s.io/pod-group: nginx-pg
      spec:
        containers:
        - name: nginx-pg
          image: nginx
          resŏurceš:
             limits:
               cpu: 3000m
               memory: 500Mi
             requests:
               cpu: 3000m
memory: 500Mi
```







```
$ cat podgroup.yaml.debug
apiVersion: scheduling.x-k8s.io/v1alpha1
kind: PodGroup
metadata:
  name: sleep-pg
namespace: slurm-bridge
  annotations:
    slinky.slurm.net/account: slurm
slinky.slurm.net/job-name: podgroupSleep
spec:
  minMember: 2
apiVersion: v1
kind: Pod
metadata:
  name: sleep1
  namespace: slurm-bridge
  labels:
    app: sleep-pg
scheduling.x-k8s.io/pod-group: sleep-pg
spec:
  restartPolicy: Never
  containers:
  - name: my-container
    image: busybox
command: ["sh", "-c", "sleep 20 && exit 0"]
apiVersion: v1
kind: Pod
metadata:
  name: sleep2
  namespace: slurm-bridge
labels:
    app: sleep-pg
scheduling.x-k8s.io/pod-group: sleep-pg
spec:
  restartPolicy: Never
  containers:
  - name: my-container
    image: busybox
    command: ["sh", "-c", "sleep 20 && exit 0"]
```

Second multi-node workload, this time with the pods explicitly enumerated.

<pre># Slurm Bridg NAME nginx-pg-fwhd nginx-pg-rq2k sleep1 sleep2</pre>	READY c 1/1		RES 0 0 0 0	TARTS	AGE 91s 91s 4s 4s				
nginx-pg Ru	atus ASE nning heduling	MINMEMB 2 2	ER	RUNNII 2	NG	SUCCEE	DED F	AILED	AGE 91s 5s
# Slurm sinfo JOBID PARTIT 17 slurm- 18 slurm-	bridge p	NAME ogReplicas oodgroupSl		USER slurm slurm		TIME 1:30 0:00	NODES 2 2		IST(REASON) bridge-[1-2 urces)
# Slurm squeu PARTITION slurm-bridge slurm-bridge	AVAIL TI up i	IMELIMIT infinite infinite	NODE	2 allo	oc sl	DELIST .urm-br .urm-br	idge-[1	-2]	



# Slurm Bric NAME READ sleep1 1/1 sleep2 1/1	9	US RESTAF ing 0	RTS AGE 44s 44s	s slu	rm-b	ridge- ridge-			
NAME F	Status PHASE Running	MINMEMBEF 2	RUNN 2	NING	SUC	CEEDED	FAIL	ED AGE 45s	
# Slurm sinf JOBID PARTI 18 slurn		NAME podgroupS		JSER slurm	ST R	TIME 0:10	NODES 2	NODELIST(R slurm-brid	,
# Slurm sque PARTITION slurm-bridge slurm-bridge	AVAIL e up	TIMELIMIT infinite infinite	NODES 2 1	allo	c sl	DELIST urm-br urm-br	idge-[1 idge-0	-2]	



Slurm Bridge Scheduler Pods NAME READY STATUS NODE RESTARTS AGE sleep1 Completed slurm-bridge-1 0/1 0 75s sleep2 0/1 Completed 0 slurm-bridge-2 75s # PodGroup Status NAME PHASE RUNNING SUCCEEDED FAILED AGE MINMEMBER 77s sleep-pg Finished 2 2 # Slurm squeue PARTITION AVAIL TIMELIMIT NODES STATE NODELIST slurm-bridge infinite idle slurm-bridge-[0-2] 3 up



Everything complete. Workload controller has ensured system state is kept in sync. Pods can be deleted, or placeholder jobs cancelled or timed out, and will reconcile system state between the two.

Future Work

Future Work

- Further refinement, documentation, and testing of the Slurm Operator
- Work with the Kubernetes community to be able to handle fine-grained control and understanding of native resources
 - "DRA-for-Cores"
 - Publish CPU affinity mapping for other DRA devices
- Allow for Slurm to operate as a pure Kubernetes scheduler
 - Remove requirement for slurmd daemon on nodes managed by the Slurm Bridge
 - Requires new "external" node status within Slurm to indicate Slur's own resource management layer is disabled
 - Requires extension to the Slurm Workload Controller to automatically create "external" nodes within Slurm
- Investigation into better coordination with Autoscaler



CPU affinity - HPC requirements

- HPC workloads have a broad range of ways to model their internal application layouts
- HPC workload managers evolved to support a huge range of options
- Subset of these allocation options:
 - number-of-tasks, number-of-nodes, number-of-tasks-per-node
 - cpus, cpus-per-gpu, cpus-per-node, cpus-per-task
 - o gpus, gpus-per-node, gpus-per-task, gpus-per-socket
 - sockets-per-node, threads-per-core
 - gpu-to-cpu-pinning



CPU resource management

- CPU resource management
 - Significant functional gap compared to Slurm's native resource management
 - CPU affinity has significant performance impacts on most workloads
 - Managed by through the Linux cpuset cgroup controller
 - Kubernetes lacks centralized planning for CPUs
 - Delegated to the runtime
 - But precludes effective backfill scheduling
 - Discussing different models with the device management wg and others
 - May publish a POC DRA driver for CPUs while discussing whether something should be pushed into core Kubernetes



Questions?

Thank You



https://github.com/SlinkyProject



