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# Capacity Scheduling for Elastic Resource Sharing in Kubernetes

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# About us



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# Agenda

- **Introduction**
- Capacity Scheduling
- Job Queue
- Demo
- Summary

# The Diversity of Workloads in Kubernetes

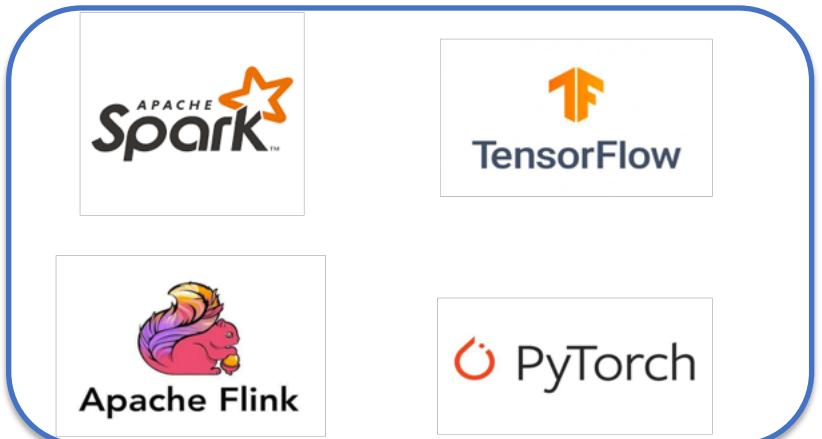


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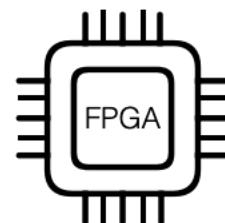
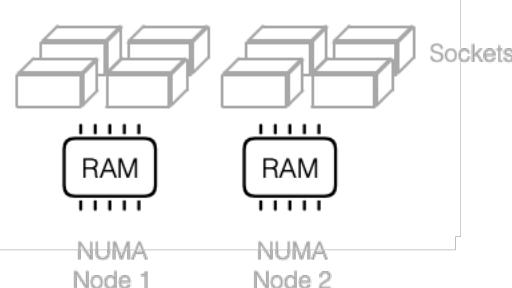
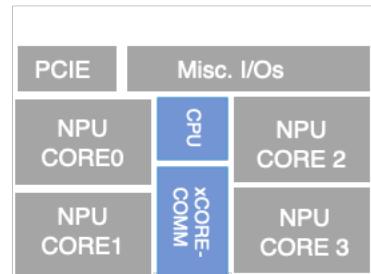
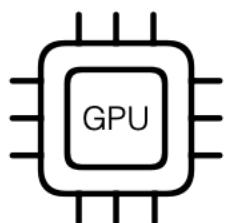
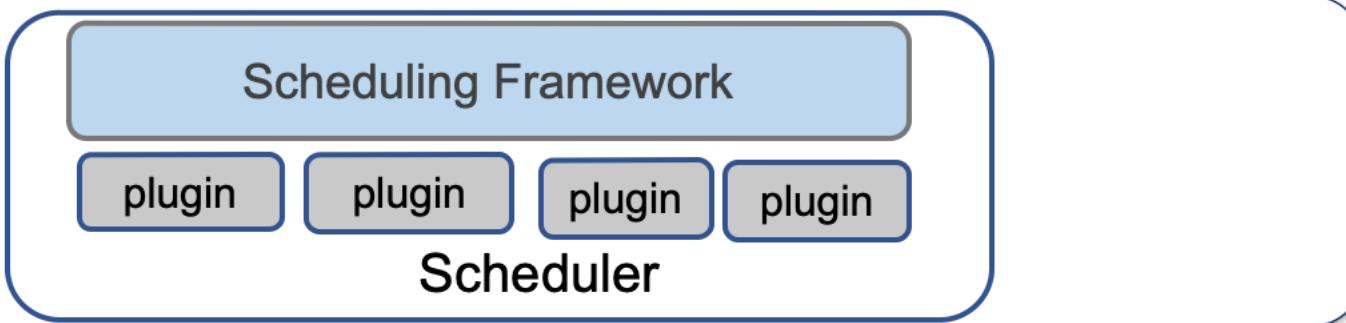
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Batch  
Workloads



Kubernetes



# Resource Sharing in Kubernetes

## Current status

- Quota is for capacity planning and admission control
- A single resource quota (request) value for a namespace
- Pod priority-based preemption

## As a result

- Lack of flexible resource sharing between namespaces
- Low cluster utilization
- A roadblock to efficiently running batch workloads in k8s

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## Dynamic resource sharing between namespaces

- Elastic quotas
- Fair sharing
- Hierarchical resource quotas

# Elastic Quotas

- *ElasticQuota* CRD
- Min and Max resources
  - Min: guaranteed resource
  - Max: maximum resource
- Multi-resource types
  - CPU, memory, disk, GPU, extended resources
- Independent of existing *ResourceQuota*

```
// ElasticQuotaSpec defines the Min and Max for Quota.  
type ElasticQuotaSpec struct {  
    Min v1.ResourceList  
    Max v1.ResourceList  
}
```

```
apiVersion: scheduling.sigs.k8s.io/v1alpha1  
kind: ElasticQuota  
metadata:  
  name: test  
  namespace: test  
spec:  
  max:  
    cpu: 20  
    memory: 40Gi  
    nvidia.com/gpu: 2  
  min:  
    cpu: 10  
    memory: 20Gi  
    nvidia.com/gpu: 1
```

# Resource Guarantee and Fairness

When an `ElasticQuota(namespace)`'s min resource cannot be met

$$\text{Resource.Request} + \text{Resource.Allocated} < \text{ElasticQuota.Min}$$

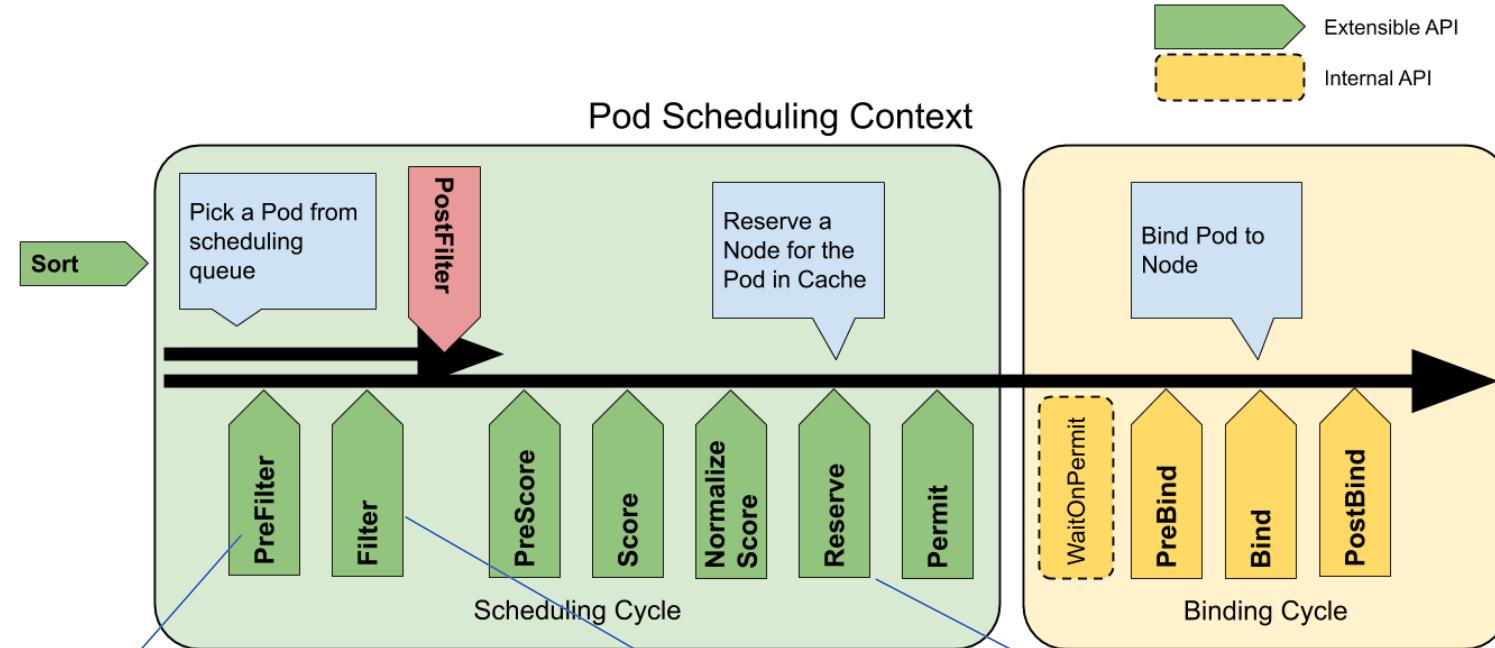
## Preemption

- `ElasticQuota/Namespace` candidates

$$\text{Resource.Request} + \text{Resource.Allocated} > \text{ElasticQuota.Min}$$

- Pod candidates: lower priority pods first, minimize the number of evicted pods

# Capacity Scheduling Implementation



**PreFilter:** Ensure that the used resources of every elastic quota doesn't exceed max

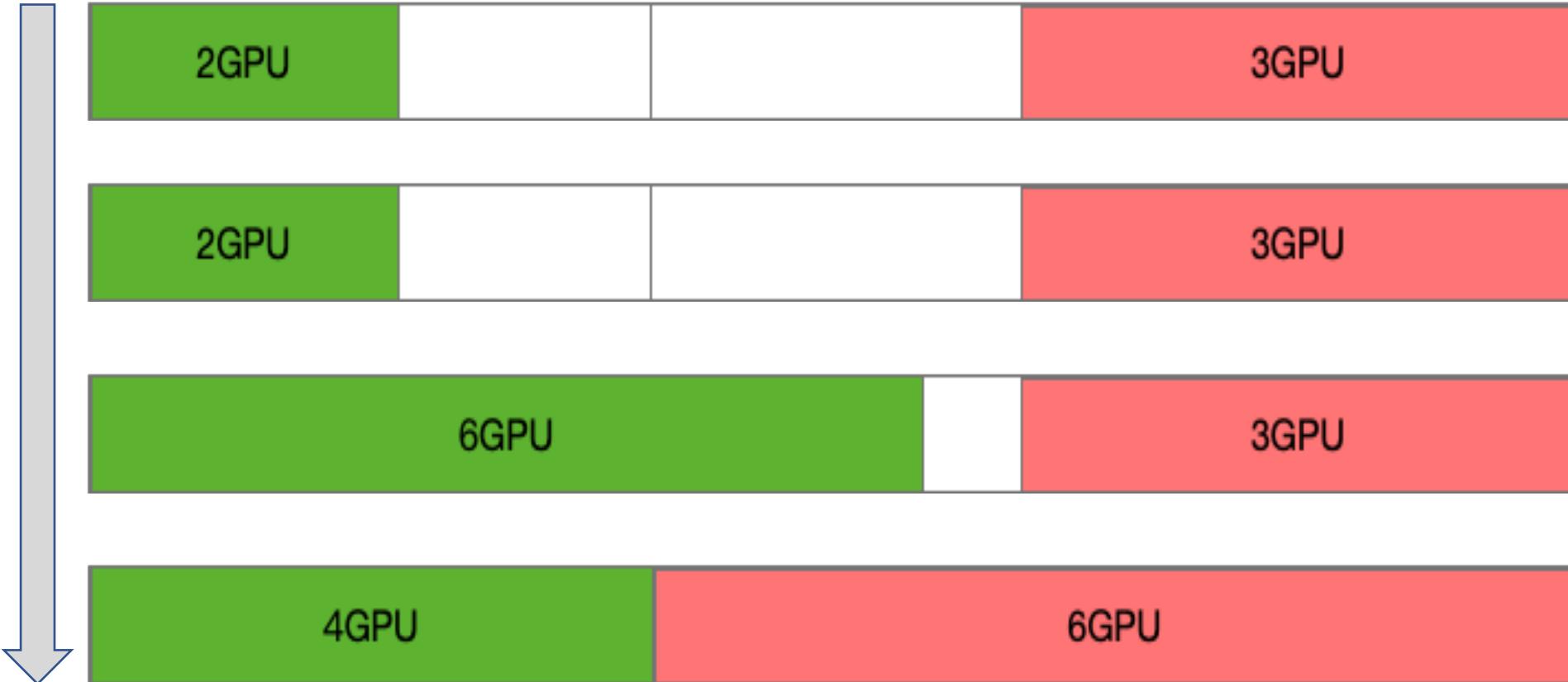
**PostFilter:** Custom preemption to ensure guaranteed resources

**Reserve:**

- Reserve the scheduling result to prevent reallocation to other pods
- Clean the scheduling result if failure occurs in the binding cycle

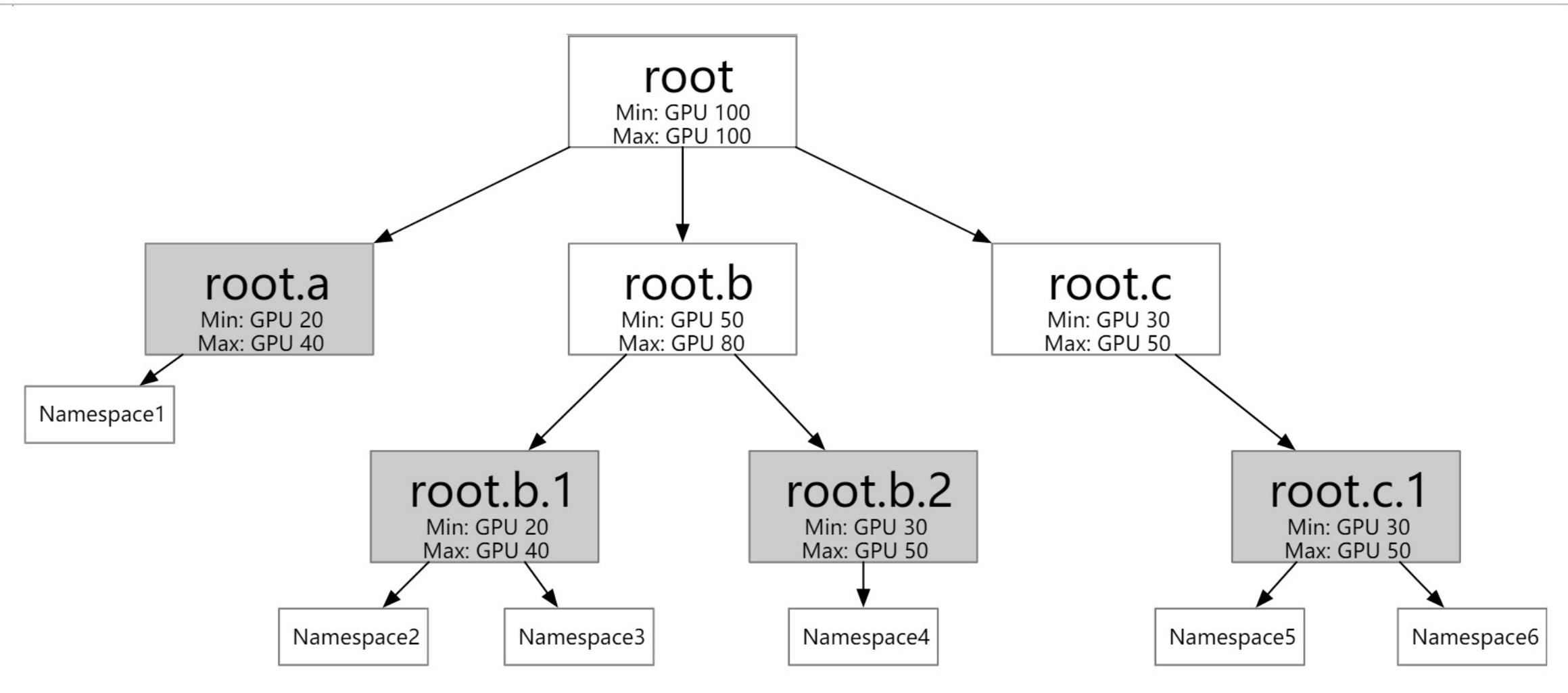
# Elastic Quota Examples

Namespace 1: min:4, max:6



Namespace 2: min:6, max:8

# Hierarchical Quota



# Hierarchical Elastic Quota Example

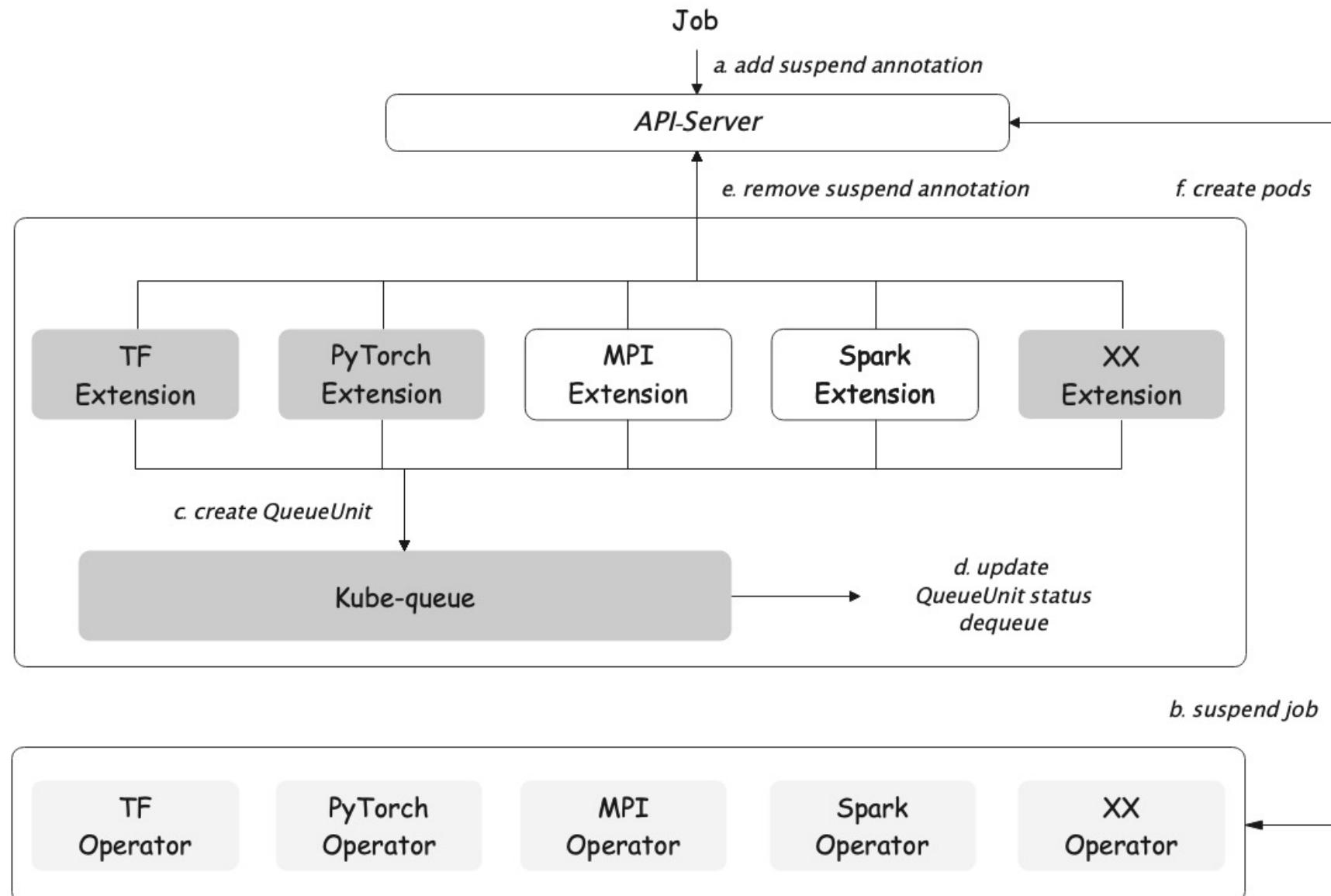
```
apiVersion: scheduling.sigs.k8s.io/v1beta1
kind: ElasticQuotaTree
metadata:
  name: elasticquotatree
  namespace: kube-system # The elastic quota group takes effect only if it is created
spec:
  root:
    name: root # Configure the resource quota of the root. The maximum amount of resources
    max:
      cpu: 40
      memory: 40Gi
      nvidia.com/gpu: 4
    min:
      cpu: 40
      memory: 40Gi
      nvidia.com/gpu: 4
    children: # Configure resource quotas for the leaves of the root.
    - name: root.a
      max:
        cpu: 40
        memory: 40Gi
        nvidia.com/gpu: 4
      min:
        cpu: 20
        memory: 20Gi
        nvidia.com/gpu: 2
      children: # Configure resource quotas of the farthest leaves.
      - name: root.a.1
        namespaces: # Configure resource quotas of the namespaces.
        - namespace1
          max:
            cpu: 20
            memory: 20Gi
            nvidia.com/gpu: 2
          min:
            cpu: 10
            memory: 10Gi
            nvidia.com/gpu: 1
        - name: root.a.2
          namespaces: # Configure resource quotas of the namespaces.
          - namespace2
            max:
              cpu: 20
              memory: 40Gi
              nvidia.com/gpu: 2
            min:
              cpu: 10
              memory: 10Gi
              nvidia.com/gpu: 1
      - name: root.b
        max:
          cpu: 40
          memory: 40Gi
          nvidia.com/gpu: 4
        min:
          cpu: 20
          memory: 20Gi
          nvidia.com/gpu: 2
        children: # Configure resource quotas of the farthest leaves.
        - name: root.b.1
          namespaces: # Configure resource quotas of the namespaces.
          - namespace3
            max:
              cpu: 20
              memory: 20Gi
              nvidia.com/gpu: 2
            min:
              cpu: 10
              memory: 10Gi
              nvidia.com/gpu: 1
        - name: root.b.2
          namespaces: # Configure resource quotas of the namespaces.
          - namespace4
            max:
              cpu: 20
              memory: 20Gi
              nvidia.com/gpu: 2
            min:
              cpu: 10
              memory: 10Gi
              nvidia.com/gpu: 1
```

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- Manage workloads instead of pods
- Schedule workloads according to **priorities, creation time, quotas**: *ResourceQuota, ElasticQuota, Cluster Capacity*
- Provide fairness between different queues (under development)

# Job Queue Management



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## Elastic Quota Demo

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## Open source projects

- Elastic quota and capacity scheduling  
<https://github.com/kubernetes-sigs/scheduler-plugins/tree/master/pkg/capacitryscheduling>
- Job queue  
<https://github.com/kube-queue/kube-queue>
- Hierarchical quota (next)

## Early adoptions

- Alibaba Cloud: AI/ML, Spark on Kubernetes
- Apple: Spark on Kubernetes (ongoing)
- Baidu: Self-driving simulation (ongoing)

# References

- <https://github.com/kubernetes-sigs/scheduler-plugins/tree/master/pkg/capacitryscheduling>
- <https://github.com/kube-queue/kube-queue>
- <https://www.alibabacloud.com/help/doc-detail/213695.htm>
- [https://help.aliyun.com/document\\_detail/213695.htm \(in Chinese\)](https://help.aliyun.com/document_detail/213695.htm)

# Acknowledgement

Many thanks to people who have contributed to the projects  
*(in alphabetical order)*

- Abdullah Gharaibeh (Google)
- Aldo Culquicondor (Google)
- Chenkun Yao (Alibaba Cloud)
- Fei Guo (Alibaba Cloud)
- Jichuan Sun (SmartMore)
- Kai Zhang (Alibaba Cloud)
- Lei Yin (Alibaba Cloud)
- Wang Zhang (Tencent Cloud)
- Wei Huang (IBM)
- Xuan Gong (Salesforce)
- Yan Xu (Apple)



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# Thank you!

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