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BUILDING FOR THE ROAD AHEAD

North America 2022

# **DETROIT 2022**

### KubeCon CloudNativeCon

BUILDING FOR THE ROAD AHEAD

### **DETROIT 2022**

## Sustainability Research the Cloud Native Way



#### BUILDING FOR THE ROAD AHEAD

## **DETROIT 2022**

October 24-28, 2021



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### **Cloud Native Sustainability**

Energy Efficiency =  $MC^3$ 

### <u>M</u>etrics

## <u>Correlation</u>

#### Container Level Power Metrics Energy Efficienciency Aware Reporting Workload Scheduling

### Correction Online Workload Tuning

### for Energy Efficienciency

### <u>C</u>arbon

#### Carbon Aware Workload Dispatching

#### Project KEPLER

KEPLER (Kubernetes-based Efficient Power Level Exporter) uses eBPF to probe energy related system stats and exports as Prometheus metrics

#### Project PEAKS

PEAKS (Power Efficiency Aware Kubernetes Scheduler) Scheduler uses metrics exported by KEPLER and correlation between energy efficiency, resource utilization, and hardware characteristics to schedule workload to achieve optimal performance per Watt

#### Project CLEVER

CLEVER (Container Level Energy-efficient VPA Recommender) uses ML models to predict and correct Pod resource usage to optimize performance per Watt Workloads are dispatched to zones that have low current and projected carbon emission footprint to ensure the sustainability objectives are retained during the workloads' lifecycle.

### Cloud Native Power Measurement: Accuracy, Fair, Multi-granular



### Kepler: <u>Kubernetes-based</u> <u>Efficient</u> <u>Power</u> <u>Level</u> Export<u>er</u>

https://github.com/sustainable-computing-io/kepler



- Per Pod level energy consumption reporting, including CPU/GPU, RAM
- Support bare metal as well as VM
- Support Prometheus

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Reduction

Reduced computational

resource used by the

probe

Using **eBPF** 

### Regression

- Scientific research based

### ML models







### **Kepler Design Overview**



## Kepler Dashboard



Kepler is currently being contributed by developers from the following companies, in chronological order. It has applied for CNCF Sandbox



### **Problem: Frequency Awareness in Vertical Scaling**

When frequency tuning controllers increase/decrease CPU frequencies, how can we guarantee the performance of workload stay the same?

### Background: Vertical Pod Autoscaler on Kubernetes



[1] Kubernetes Vertical Pod Autoscaler, https://github.com/kubernetes/autoscaler/tree/master/vertical-pod-autoscaler

### CLEVER: Container Level Energy-Efficient VPA Recommender



aware VPA.

Carbon footprint can be reduced via improving the objective of performance per watt for containers, namely finding efficient way to guarantee a certain QoS/performance for a workload.

- Lower Frequency: Reducing Energy Consumption.
- Increase CPU allocation: guarantee QoS

### What is target Performance/QoS?



## Demo

- 1. Deploy Kepler
- 2. Show Kepler dashboard
- 3. Deploy VPA
- 4. Deploy Clever Recommender
- 5. Test workload using VPA with Clever Recommender





Kepler

Clever

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solving deltas: 100% (101254/101254), done.		Wandling contection for 2000
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## **Beyond Power Reporting**



KEDA: Carbon Aware Scaling PoC

## Looking forward

Carbon	<ul> <li>Reduce carbon footprint by carbon aware scheduling and scaling.</li> <li>At what carbon intensity to start the compute job?</li> <li>At which region to start the compute job?</li> <li>How many replica to scale under different carbon intensity?</li> </ul>
Energy	<ul> <li>Measure, manage, and optimize workload energy consumption</li> <li>How much energy consumed by the workloads?</li> <li>How to improve the workload performance per watt?</li> </ul>
Water	<ul> <li>Reduce water usage in Data Centers</li> <li>Reduce heat and cooling cost, improve workload energy efficiency</li> <li>Adopt metrics aware workload scheduling and scaling</li> </ul>
Waste	<ul> <li>Reduce overhead in compute and storage, extend device lifetime</li> <li>Reduce resource requirement for workload and systems</li> <li>Reduce redundancy in compute and storage</li> </ul>