

Level 5	5	Continuous improvement occurs based on quantitative feedback.
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Areas Implemented

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Recommendations

Development:

 $1. \ \ \textbf{Optimize source code for energy and carbon emissions using static code analysis}$

Avoid usage of static collections.	87
Avoid multiple if-else statement	61
Do not call a function when declaring a for-type loop	54
Use ++i instead of i++	43
String Builder	29
Avoid getting the size of the collection in the loop	23
Avoid creating and starting threads directly	17
Avoid using Pattern.compile() in a non-static context	11
Free Resources	2
Use System. arraycopy to copy arrays	1

2. Memory and energy utilization of docker and multi-stage docker files

Energy Usage	High	Low
Build Time	5 minutes	6 minutes
Layer Count	12 layers	8 layers
Image Size	2.06 GB	2.01 GB
Cache Efficiency	Low	High
CI/CD Impact	High resource usage	Optimized resource usage

Adopt Multi-Stage Docker Files:

- Reduce memory and energy consumption during build and runtime.
- Smaller image sizes lead to faster deployments and lower storage needs.

Optimize Base Images:

- Use official, slim, or alpine versions of base images to minimize size.
- Periodically review and update base images to leverage newer, more efficient versions.

Minimize Dependency Installation:

- Only install necessary dependencies to reduce build and runtime resource usage.
- Use tools like pip-compile to manage dependencies efficiently.

Leverage Caching:

- Utilize Docker's build cache to skip unchanged layers during rebuilds.
- Implement caching for dependencies (e.g., using a proxy server for pip dependencies).

Monitor and Analyze Resource Usage:

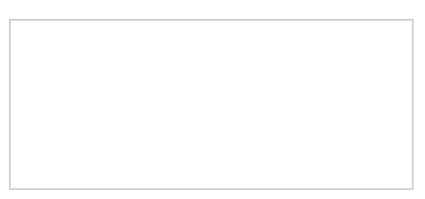
- Employ tools (e.g., Docker Stats, Prometheus, Grafana) to monitor container resource utilization.
- Analyze findings to identify optimization opportunities.

${\it 3. \ Energy\ metrics\ for\ application\ using\ Intel\ RAPL,\ Kepler,\ Schaphandre}$

CPU Model	Intel(R) Xeon(R) Platinum 8259CL CPU @ 2.50GHz		
CPU Count	2		
GPU Model	N/A		

GPU Count	N/A
RAM	3.74 GB
os	Linux
Country	United States
Region	Virginia

44.28 Seconds	0.001309 Kwh	0.000483 kg	0.00001091 kg/s



Monitor and Optimize: Regularly collect energy metrics to identify optimization opportunities in your application.

Set Sustainability Goals: Establish targets for your Sustainability Score (SS) or individual energy metrics to drive improvement.

Energy-Aware Scheduling: Utilize Kepler to schedule workflow tasks during periods of low energy demand or when renewable energy sources a available.

Hardware/Software Co-Optimization: Collaborate with hardware teams to optimize system configurations for improved energy efficiency.

Continuously Update and Refine: As new energy-efficient technologies and methodologies emerge, incorporate them into your application and workflows.

4. Energy consumption of ML job, Model training

Optimize Model Architecture:

- Use efficient neural network architectures (e.g., MobileNet, SqueezeNet, EfficientNet) that require less computational resources.
- Apply model pruning, knowledge distillation, or quantization to reduce model size and computational requirements.

Select Energy-Efficient Hardware:

- Utilize GPU accelerators with high performance-per-watt ratios (e.g., NVIDIA Ampere or AMD CDNA).
- Consider TPU (Tensor Processing Unit)-based solutions for large-scale ML workloads.
- Explore FPGA (Field-Programmable Gate Array)-based accelerators for customized, energy-efficient computations.

Efficient Training Methodologies:

Employ transfer learning to fine-tune pre-trained models, reducing training time and energy.

- $\bullet \quad \text{Use early stopping techniques to halt training when satisfactory performance is achieved}. \\$
- Apply distributed training with optimized parallelization to minimize overall training time.

Data Efficiency:

- Use smaller, representative datasets for training, reducing computational requirements.
- Apply data augmentation to artificially increase dataset size without adding new samples.

Hyperparameter Tuning and Automation:

- Utilize hyperparameter tuning tools (e.g., Hyperopt, Optuna) to quickly identify optimal configurations.
- Implement automated ML (AutoML) pipelines to streamline the training process and minimize unnecessary computations.

Network:

1. Energy efficiency for synchronous (REST vs gRPC) and Asynchronous (Kafka vs RabbitMQ) messaging between microservices

Synchronous Communication Protocols

Energy Usage	18.1 W	8.2 W
Peak Memory	4.45 MB	8 MB
Time Taken	3 Minutes	4 Min 50 Sec
Requests	500K	500K
Peak CPU	10%	4%

Asynchronous Communication Protocols

Energy Usage	19.2 W	10.68 W
Peak Memory	1024 MB	512 MB
Message Rate	1M msg/s	50K msg/s
Latency	10ms	5ms
CPU Usage	55%	35%



For Synchronous Messaging (REST/gRPC)

Use gRPC for New Developments:

• Leverage its inherent efficiency advantages, especially for microservices with high inter-service communication.

Migrate REST to HTTP/2:

• If moving to gRPC isn't feasible, ensure REST services use HTTP/2 for some efficiency gains.

Optimize Payloads:

- Use efficient serialization formats (e.g., protobuf for gRPC, consider alternatives for REST).
- Implement compression (if not already done).

Service Discovery and Load Balancing:

• Ensure efficient routing to reduce unnecessary network hops.

For Asynchronous Messaging (Kafka/RabbitMQ)

Choose Kafka for High-Volume Scenarios:

Prefer Kafka when dealing with high throughput and low-latency requirements.

Optimize RabbitMQ Configurations:

For existing RabbitMQ setups, review and optimize configurations for batching, compression, and efficient queue management.

Leverage Distributed Capabilities:

For both Kafka and RabbitMQ, ensure distributed setups are optimized to minimize energy consumption.

Deployment:

1. Tagging of resources to track usage

Mandatory Tags:

- Owner (e.g., team, department, individual)
- Environment (e.g., dev, staging, prod)
- Project/Service (e.g., project name, service identifier)

• Cost Center (e.g., budget code, department ID)

Optional Tags (as needed):

- Application
- Component
- Lifecycle (e.g., temporary, permanent)
- Compliance (e.g., PCI, HIPAA)

Tagging Best Practices:

- Use Meaningful Names: Clearly indicate the tag's purpose.
- Keep it Concise: Short tag names (< 20 characters) for easier management.
- Avoid Duplication: Use a single tag for a specific attribute (e.g., don't use both Env and Environment).
- Use Consistent Formatting: Establish a standard for tag values (e.g., all lowercase, separated by hyphens).

Tagging Structure (Hierarchy):

- Flat Structure: Simple, straightforward (e.g., Owner: JohnDoe, Environment: Prod)
- $\bullet \quad \text{Hierarchical Structure: Organized with categories (e.g., Project: MyApp/Environment: Dev, CostCenter: IT/Department: DevOps) } \\$

Instances without Tags:

marvel-windows-jumboxtest	i-07a7a6794367ded49	t3.medium
marvel-esha-windows-jumpbox-01	i-0378700bcf2ef68e7	t3.large
marvel-rapl-amd	i-0c43a18a046c87984	t3a.large
marvel-sustain	i-0571933e06349edd6	t2.medium
marvel-autoscaler-3	i-0c86e5cbdc6ef48e9	t2.medium
marvel-docker-registry	i-0121edc6357368099	t3.micro
marvel-git-perforce	i-0361799692abc3dc4	t2.medium
marvel-esha-windows-jumpbox-03	i-01b006bb7ceefd989	t3.large
marvel-Prometheus	i-00f4b18e0c7615802	t2.micro
marvel-slurm-testing-slurmctl	i-02028574274244586	t3a.small
marvel-slurm-testing-slurm-00	i-0c10cab3a673568a5	t3a.small
marvel-slurm-testing-gw	i-01528621d1601b22d	t3a.small
marvel-slurm-testing-slurmdb	i-04cf6faf1252ba6a7	t3a.small

$2. \ \ \, \textbf{Calculate energy utilization for provisioned resources and show recommendations to deployment teams}$

 $(Legend: R \ denotes \ Recommendation \ Rank)$

Under-Provisioned:

i-0011eee5f9bfa37d5	t3.large	m7i-flex.large	m6i.large	m7i.large
i-01e2bba24c61139a5	t3.large	m7i-flex.large	m6i.large	m7i.large
i-0378700bcf2ef68e7	t3.large	m7i-flex.large	m6i.large	m7i.large
i-061783c19995cf461	t3.large	m7i-flex.large	m6i.large	m7i.large
i-06b0d1885c8bfb73a	t2.medium	c7i-flex.large	c6i.large	c5.large
i-07d971daf49d26ba6	t3.large	m7i-flex.large	m6i.large	m7i.large
i-07fc1239a8432b1ff	t2.nano	t3.small	t3.medium	t3.large
i-0803db063f7902be8	t2.nano	t3.small	t3.medium	t3.large
i-0a30bd8f427568294	t2.large	m7i.large	r7i.large	c7i-flex.xlarge
i-0bcac5f25c482c094	t3.large	m7i-flex.large	m6i.large	m7i.large
i-0e7f58282fba77a57	t3.xlarge	m7i-flex.xlarge	m6i.xlarge	m7i.xlarge

Over-Provisioned:

i-07a7a6794367ded49	t3.xlarge	r7i.large	t3.xlarge	-
i-0f6c16ceb8ea482c2	t3.2xlarge	r6i.xlarge	r7i.xlarge	t3.2xlarge
i-0f97772fef03977df	t3.xlarge	r6i.large	r7i.large	t3.xlarge
i-0fda6069f43c06df1	t3.xlarge	r7i.large	t3.xlarge	-

3. Identify Unused Resources

Unused EC2 Resources:

marvel-GenAI-partha	i-0a1748bca3199a63f	t3.medium	274

marvel-LLM-test	i-0b43ba541b65fcd8f	t3.2xlarge	175
marvel-mddp-devsecops	i-0c73c29f8e5d01576	t3.xlarge	162
marvel-EEaaS-Kubernetes	i-0ced2e371b3425fe5	t3.large	142
marvel-TEaas-openstack-kolla	i-0842262e5bb3e2915	t3.xlarge	141
marvel-awx-ansible	i-0d5da5ba883efcf5b	t3.xlarge	127
marvel-Neureda-registry	i-0dc340b462af4ed74	t3.medium	125
marvel-windows-jumboxtest	i-07a7a6794367ded49	t3.medium	122
marvel-PlatformEng-Keycloak	i-0161cf03311390911	t3.medium	121
marvel-PE-mddp-k8s-1	i-0bfe201057f0db5f9	t3.2xlarge	121
marvel-Prometheus	i-00f4b18e0c7615802	t2.micro	120
marvel-slurm-testing-slurmctl	i-02028574274244586	t3a.small	120
marvel-slurm-testing-slurm-00	i-0c10cab3a673568a5	t3a.small	120
marvel-slurm-testing-gw	i-01528621d1601b22d	t3a.small	120
marvel-slurm-testing-slurmdb	i-04cf6faf1252ba6a7	t3a.small	120
mfdm_qual_dd_pg	i-03b6cc42f6ee8679a	t2.medium	116
tcsnxgnmfdmins5	i-054d01dc2082a9968	t3.large	114
tcsnxgnpemonobs01	i-0a30bd8f427568294	t2.large	114
tcsnxgnpemonobs02	i-0644a1225a61cfad0	t3.medium	114
tcsnxgnpemonobs03	i-0f4a538834c7f8379	t2.large	114
tcsnxgnmfdmins1	i-06f35320739d13110	t3.medium	113
tcsnxgnmfdmins3	i-0dd30488163388001	t3.medium	113
tcsnxgnmfdmins2	i-030fdebbe195c6d05	t3.medium	113

4. Turn off workloads and node pools outside of business hours

Automate Shutdown/Startup

 $\bullet \quad \text{What It Is: Scripted automatic shutdown/startup of workloads outside business hours.} \\$

Sustainability Benefits:

- Reduced energy consumption
- Lower greenhouse gas emissions

Decreased e-waste from prolonged hardware lifespan

Identify Non-Essential Workloads

What It Is: Analyzing workloads to determine which can be safely turned off during non-business hours.

Sustainability Benefits:

- Targeted energy reduction
- Minimized unnecessary resource utilization
- Enhanced overall efficiency

Autoscaling Configuration (Node Pools)

• What It Is: Configuring node pools to autoscale down to 0 nodes during non-business hours.

Sustainability Benefits:

- Dynamic energy consumption adjustment
- Significant reduction in idle resource energy waste
- Enhanced environmental responsiveness

Scheduled Node Pool Management

What It Is: Scheduling node pool shutdowns/startups using platform-specific features or tools.

Sustainability Benefits:

- Predictable energy savings
- Reduced operational carbon emissions
- Improved resource utilization efficiency

Node Pool Sizing Optimization

• What It Is: Regular review to optimize node pool sizing.

Sustainability Benefits :

- Continuous energy efficiency improvement
- Reduced e-waste through minimized node replacements
- Lower environmental impact

$5. \ \ Show\ energy\ efficient\ resource\ provisioning\ options\ during\ provisioning$

Please refer to this \underline{link} for a guide on how to implement this.

6. Implement pre-checks for common issues in CI/CD pipeline to avoid failures in different stages of pipeline

Please refer to this \underline{link} for a guide on how to implement this.

Details

1. Development (4/24)

Areas Implemented:

- Energy metrics for application using Intel RAPL, Kepler, Schaphandre
- Energy consumption of ML job, Model training
- Optimize source code for energy and carbon emissions using static code analysis
- Compare memory and energy utilization of docker and multi-stage docker files

Areas to be Implemented:

- Simplicity and Efficiency Trade-offs while developing algorithms
- Efficient Software Algorithms and data structures
- Efficient integration and delivery pipelines (Dev, Test, CI env)
- On demand development environments
- Minimizing unnecessary code execution
- Utilizing lazy loading
- Optimize energy consumption for Python and Java applications
- \bullet Leverage LLMs to suggest energy efficient algorithms for Java / Python applications in IDE
- Provide configurable deployment of applications with selected features to minimize resource utilization
- Calculate energy utilization at function level
- Optimize energy utilization of applications using AI/ML
- Memory optimization for applications
- Rightsizing containers and VM's based on resource utilization
- Compare and suggest open-source tools which are energy efficient
- Train models with custom rules for optimization of code
- Suggest optimized version of built-in functions which are energy efficient in IDE / static analyzer
- Code splitting Convert code to smaller files which can be loaded on-demand
- Tree shaking: This technique helps reduce the overall application size by removing unused code from the final build, thus optimizing the web product and minimizing resource consumption
- Split large code repositories
- Remove dead code and unused data from application

2. Network (1/2)

Areas Implemented:

• Compare energy efficiency for synchronous (REST vs gRPC) and Asynchronous (Kafka vs RabbitMQ) messaging between microservices

Areas to be Implemented:

 Optimize data transfer (Implement local data processing, aggregation and compression techniques to avoid transfer of frequent, large amounts data)

3. **Deployment (7/19)**

Areas Implemented:

- Tagging of resources to track usage
- Calculate energy utilization for provisioned resources and show recommendations to deployment teams
- Identify and share report on unused resources
- Turn off workloads and node pools outside of business hours
- Show energy efficient resource provisioning options during provisioning
- Implement pre-checks for common issues in CI/CD pipeline to avoid failures in different stages of pipeline
- Workload allocation on energy efficient servers, VMs

Areas to be Implemented:

- Deploy application in a region that is closest to users
- Deploy in regions that are powered by renewables or energy efficient resources
- Energy efficient workload scheduling
- CPU frequency optimization for non-critical workloads
- Alerts during resource provisioning (to avoid over provisioning) about energy consumption and energy efficient options
- Calculate and minimize energy utilization per transaction
- Implement automated decision between horizontal vs vertical scaling of applications
- Set up minimal artifacts Reduce disk, memory and processing demands by considering the software for a given purpose
- Schedule resource intensive tasks to execute when renewable energy source is available
- Consolidate application workloads to maximize server utilization and move idle servers to low power mode
- Measure (Idle/Normal/Peak) energy consumption of resources and identify scope for optimizations (Get power consumption per CPU core information from processor type)
- Identify unused resources in K8s using KOR tool

4. Design (0/31)

Areas Implemented:

Areas to be Implemented:

- Sustainability as NFR
- Minimal Architecture (i.e. Developing minimal software for value)
- Replace long-running service with a simple Function as a Service
- Asynchronous processing and event-driven architectures
- API Design: protocol (TCP, UDP, custom wire protocols)
- API Design: data format used for request/response of your APIs: Protobuf/gRPC is better compared to JSON, XML
- API Design: Avro schemas instead of JSON for data serialization
- Reusable APIs vs P2P Integrations
- Choice of programming language: Go, Rust over Python, Java; Java 17 is better with respect to memory optimization
- Public cloud, choice of provider, and region
- Platform as a Service (PaaS) and Serverless (e.g., Function as a Service (FaaS))
- Containers and Kubernetes Adopting energy efficient architectures such as containers or serverless
- Scheduling and batch vs. real-time Demand Shaping
- Carbon awareness into the Kubernetes Scheduler
- · Cost and Sustainability: Reducing operational costs and sustainability are aligned
- Enforce Quotas and Rate Limiting
- Reduce the Network Footprint
- Identify energy utilization of applications across different design choices
- Optimize data generation of applications
- Create reusable modules to minimize development and maintenance efforts
- Enable parallel processing using distributed computing and minimize energy consumption
- Measure KPIs on the features used by customers and remove unused features
- Energy saving mode for applications, system processes during periods of low load
- Energy budgets for applications
- Create Energy profile for application (Core Vs Non-core tasks Logging, Monitoring, Audit, Redundancy etc...)
- Improve resilience of equipment to minimize redundancy (Ensure legacy hardware can support at least core features of software)
- Shared libraries for applications
- Server-side rendering (SSR): With SSR, a web page's HTML is generated on the server and sent to the client, resulting in quicker initial load tir
 and improved search engine optimization
- React frameworks: Next.js as a framework has many built-in features for energy optimization
- Progressive Web Applications (Hybrid of native and web apps) are more energy efficient
- Optimize availability and scalability needs for application

5. Storage (0/5)

Areas Implemented:

No Areas Implemented

Areas to be Implemented:

- Dynamic provisioning of volumes for EC2 instance / Pod to automatically scale the storage size
- Identify and remove unused data and resources in cloud
- Implementing data retention, archival and deletion policies
- Utilize caching to store frequently used data
- Optimize log and metrics collection

6. Quality (0/8)

Areas Implemented:

No Areas Implemented

Areas to be Implemented:

- Code and design review for sustainability
- Document decisions using Key Design Decisions (KDDs) or Architectural Decision Records (ADRs)
- Profiling tools and static analysis Code profiling and optimization tools
- Upgrade Runtimes and Modules
- Change aware testing
- Test Case Optimization
- Risk Based Testing
- On-demand and scalable Test Environments

7. **Operations (0/12)**

Areas Implemented:

No Areas Implemented

Areas to be Implemented:

- Automated sustainability maturity assessment for applications
- Observability and CarbonOps
- Automation
- Switching instances to chipsets that offer the same processing power at lower levels of energy consumption
- Sustainable DevOps practices integrate sustainability into the software delivery process
- Optimize resource allocation using ML
- Maximize utilization of resources
- Spot Instances
- Setup sustainability goals for infrastructure, development and applications and monitor them using dashboards and reports
- Reduce the cooling requirements of servers by ensuring that applications (servers) run in optimal temperature range
- Identify zombie workloads that consume resources (e.g., Application not running within container / VM)
- Dashboard for resource utilization at cluster, node, and pod level and grouped by applications in Kubernetes