

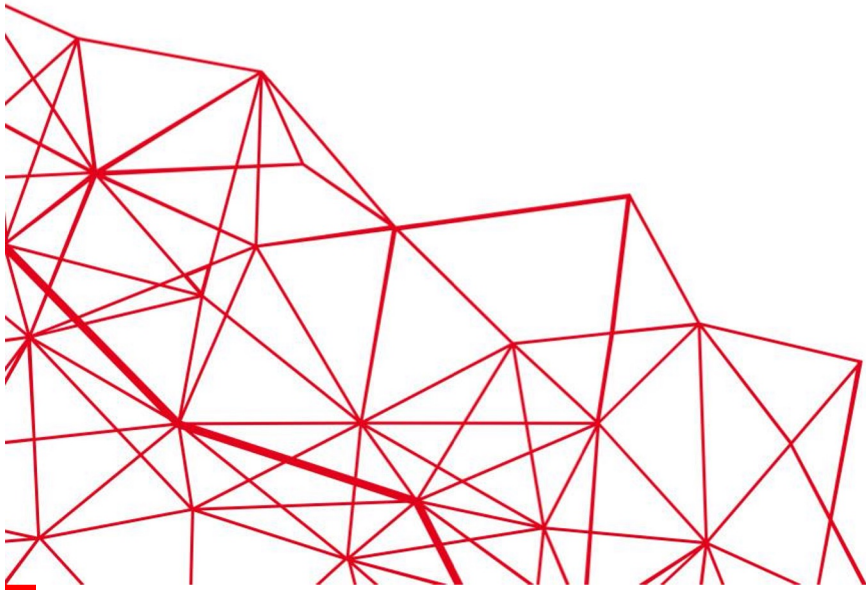
**ISC**

High Performance

REINVENTING

HPC

MAY 12 – 16, 2024 | HAMBURG, GERMANY





# EAS overview

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# Topics

- EAR overview
- Running jobs with EAR
- Job Monitoring
- Static energy optimization

[https://gitlab.bsc.es/ear\\_team/ear/-/wikis/home](https://gitlab.bsc.es/ear_team/ear/-/wikis/home)





# EAS overview



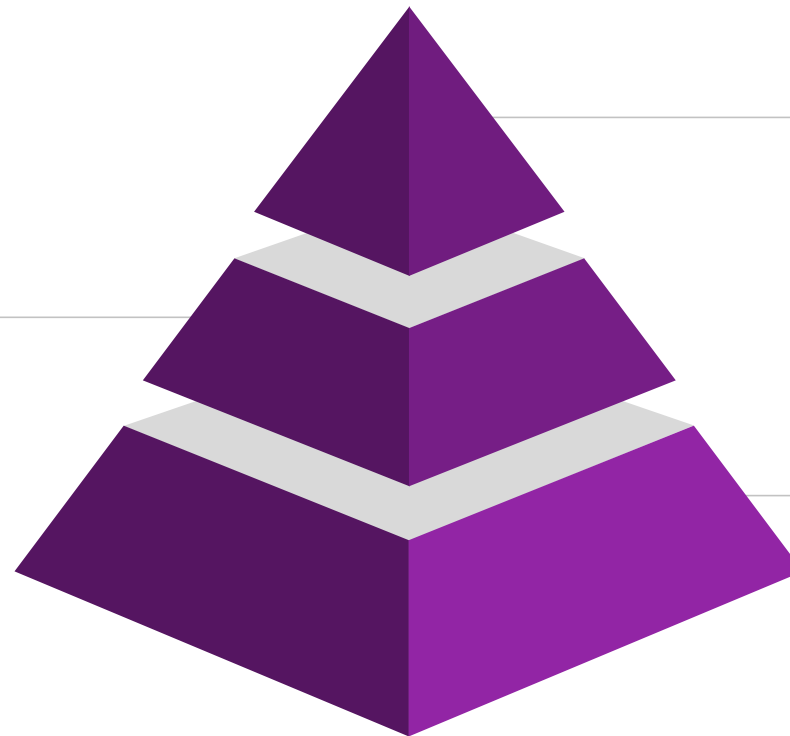
# What's EAR: System software for energy management and optimization



## Powerful application performance and power monitoring

Runtime library to monitor performance and power dynamically **without any application modification**

2



## Energy-efficient system

3

Runtime energy optimization, Cluster power management and Cluster and node powercap.

## System monitoring and Job Accounting

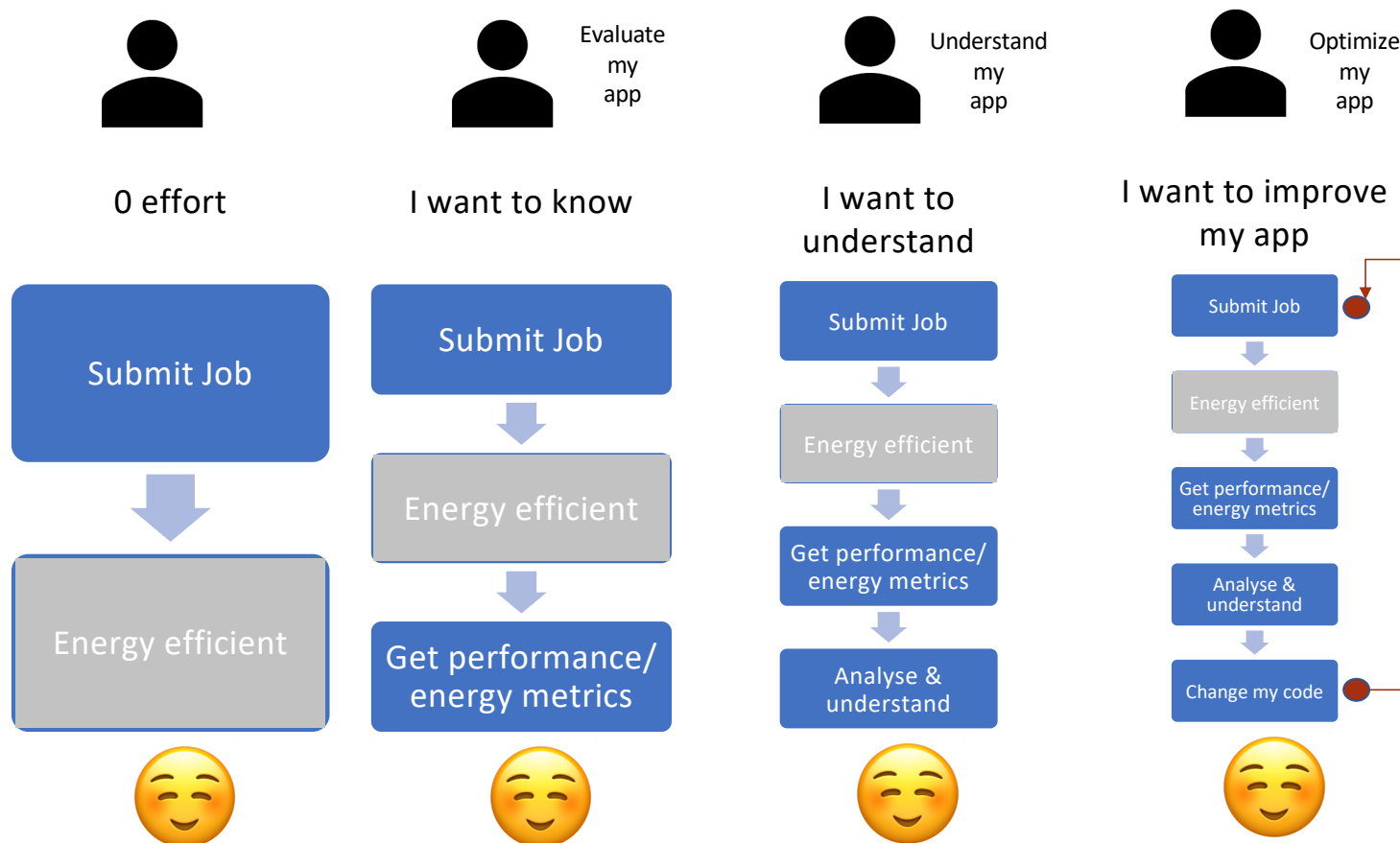
1

Reports system power consumption

Job energy accounting

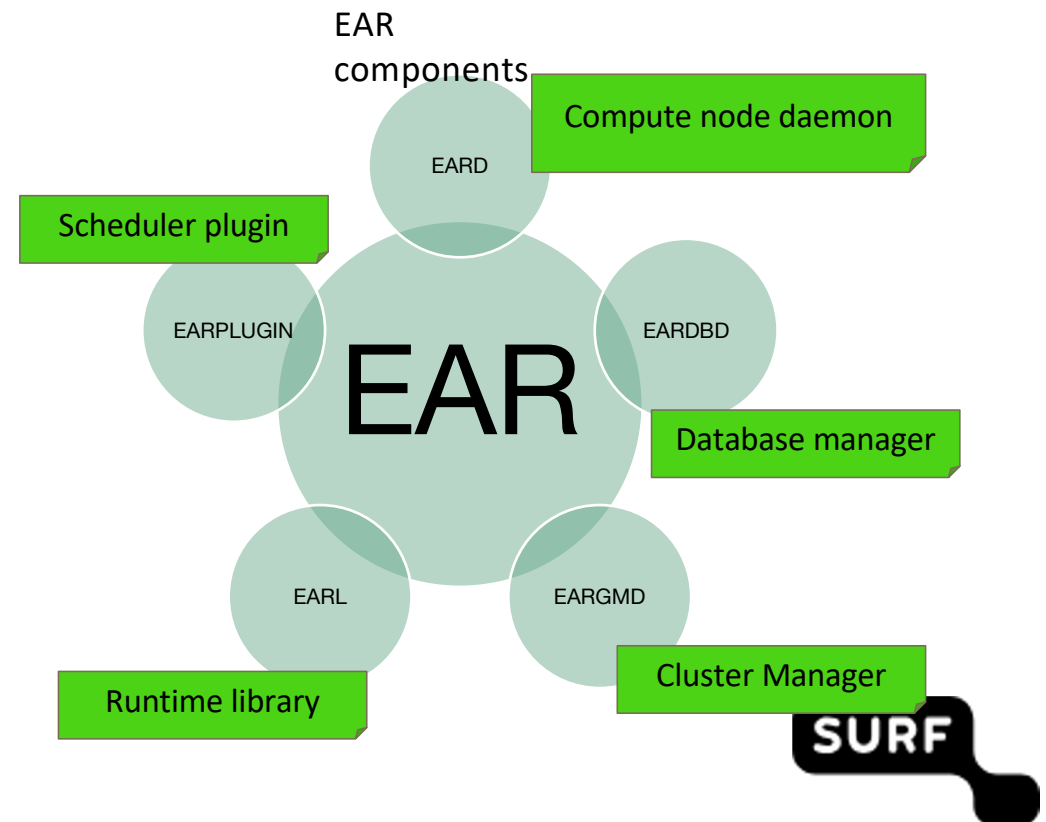


# What EAS can do for you?



# EAR Goals and Components

- To be
  - Easy to use
  - Transparent for users
  - Powerful for developers
- To optimize energy at runtime
- To be flexible and configurable
- Power management



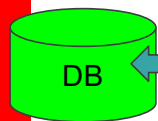
# EAR architecture



## Cluster

- monitoring
- Optimization
- Power limits

EAR Cluster power manager



EAR DB Manager

EAR DB Manager

Application

EARLib

EARD

CPU

GPU

Application

EARLib

EARD

CPU

GPU

Application

EARLib

EARD

CPU

Application

EARLib

EARD

CPU

Job Optimization,  
monitoring, power  
limits

**SURF**

<https://www.eas4dc.com>





# EAS components





# EARD: Computational Node Manager

- Linux service running in all the compute nodes (1 x compute node)
- With **root privileges**
- EARD offers
  - **Node monitoring**
  - **Basic Job accounting**
  - **Node powercap**
  - API for local metrics readings and management operations (used by EAR library)
  - API for external power and management
- Applies energy settings described in ear.conf
  - Default policy, frequency
  - Controls EAR privileged users/groups/accounts





# EARDBD: Data Base manager

- Linux service running in service nodes
- **Data Base manager.** Connects with DB server
- 1..N EARDBD can be run in the system
- EARDBD aggregates power information
  - Each EARDBD aggregates metrics for all the EARDs contacting with it for a specified period (ear.conf)
  - Each EARDBD reports data to DB in batch messages reducing the number of connections and the cost of queries





# EARL: EAR optimization library

- User-level Runtime library
- 100% transparent in most of the use cases (for example MPI applications)
- Application energy and performance monitoring
- Application dynamic energy optimization
- Extensible reporting mechanism
  - Multiple report plugins can be used: DB, CSV, etc



# EARGMD: Global/System Power Manager



- System Power manager
- Energy&Power monitoring for the whole cluster
- Cluster powercap





# Scheduler plugin

- SLURM SPANK plugin, PBS and OAR supported
- Intercepts job/step creation and
  - connects with EARD to report scheduling events : new job / end job for example
  - Configures the environment for the automatic execution of EAR and environment variables





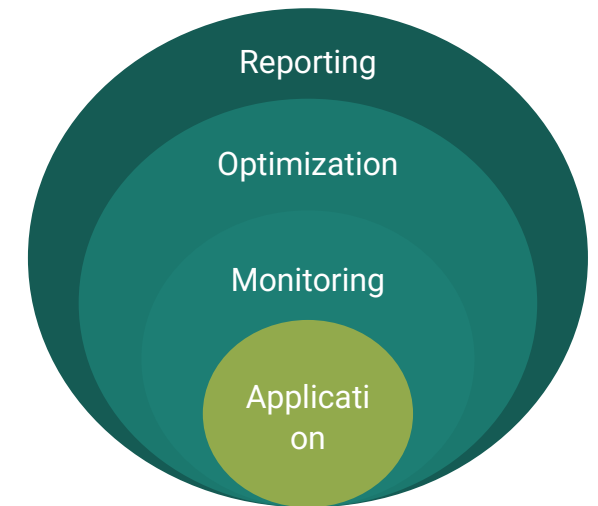
# EAR (runtime) Library

Performance metrics and energy optimization



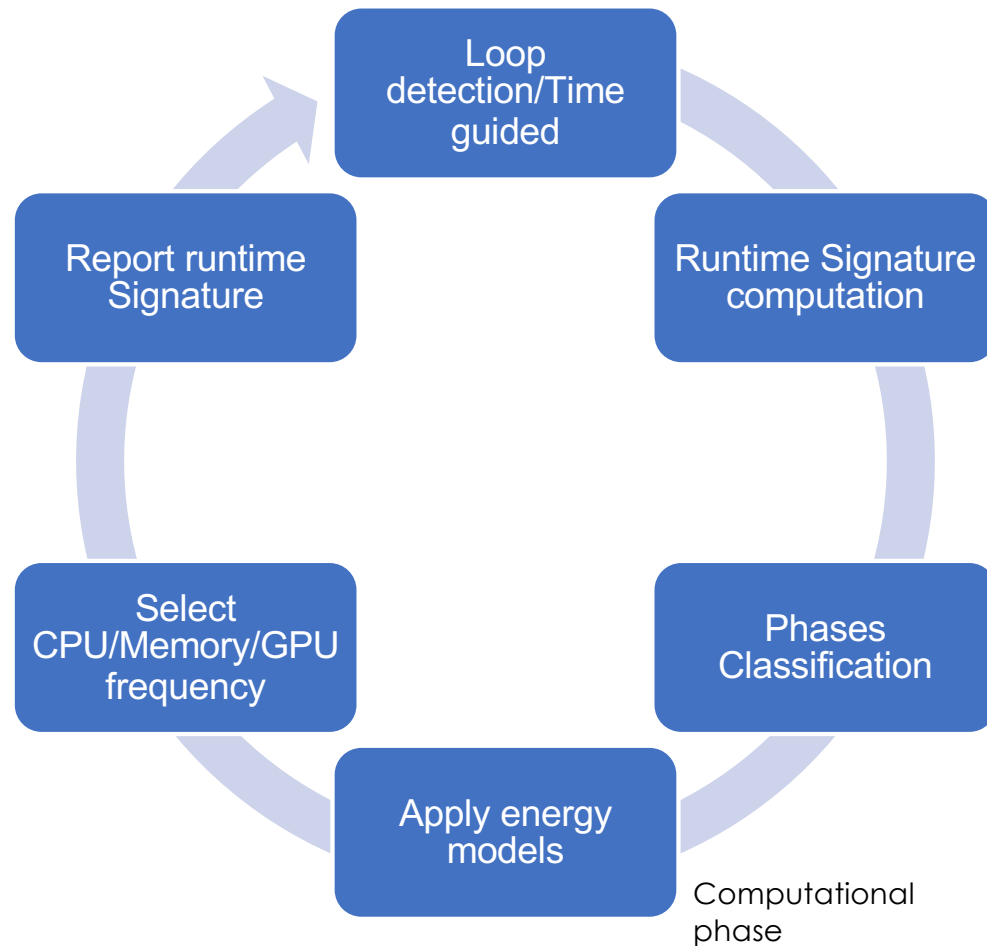
# EAR Library

- User-level Runtime library
- Transparent to users through scheduler plugin (LD\_PRELOAD used)
  - Few exceptions need some environment variables: Ex. Singularity
- Application energy and performance monitoring
- Application dynamic energy optimization
- Extensible design based on plugins
  - Multiple report plugins can be used: DB, CSV, etc
  - New policies
  - New energy models
  - ETC





# EAR Library lifecycle/stages



- Monitoring
  - Runtime loop detection (MPI only).
  - OR Time guided.
  - Automatic configuration of **chunks** for performance and power accuracy.
- Signatures report
  - Average per jobid/stepid/node.
  - Runtime metrics computed for **chunks**.

**chunk** = set of consecutive iterations with enough time to compute the power (def=10 sec.)



IO phase  
GPU bound phase  
GPU idle  
CPU busy waiting  
CPU and GPU

Specific Frequency settings

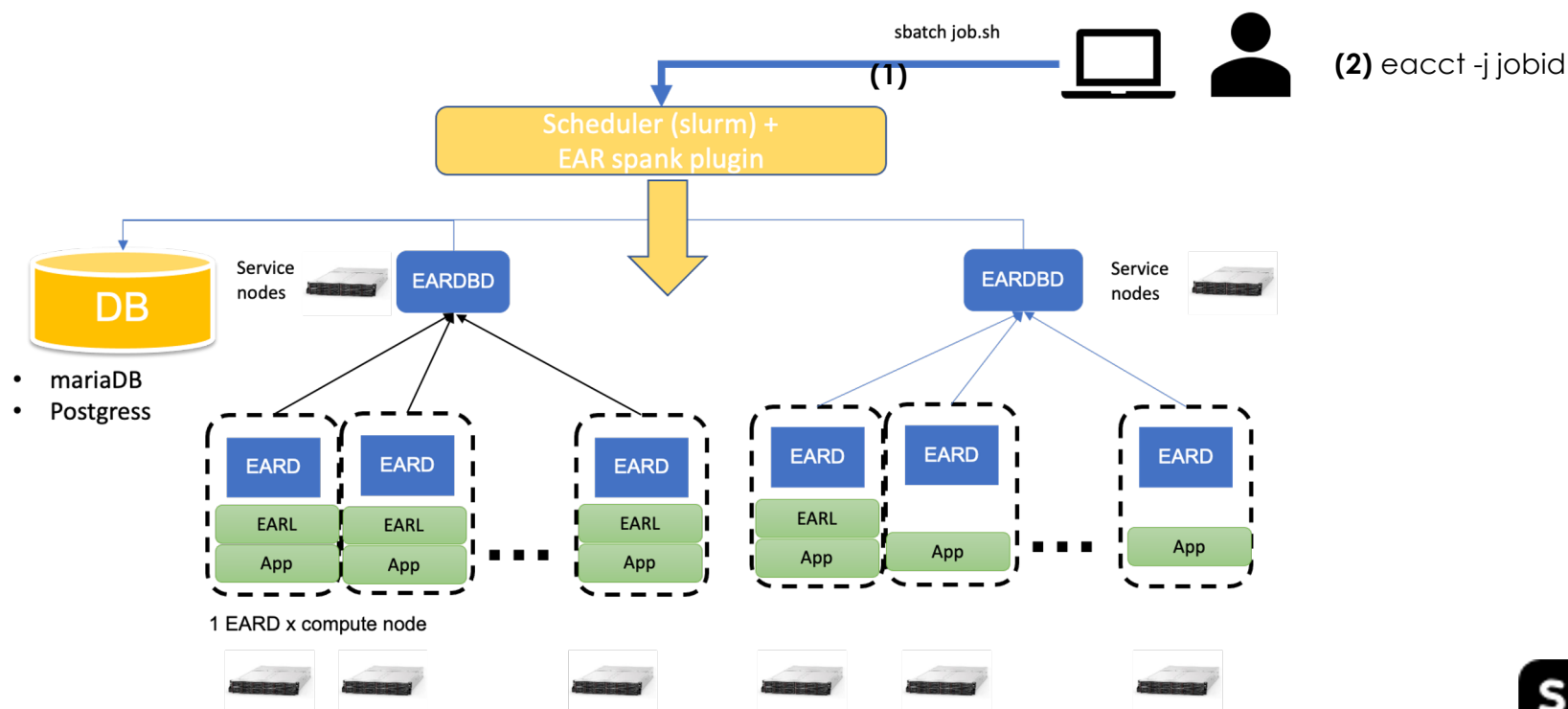




# Running jobs with EAR



# Jobs submission/accounting schema



# Job submission use cases

- **Without EAR library 100% transparent**
- **With EAR library:** To be 100% automatic EAR library needs
  - Symbol detection
  - Scheduler support (sbatch, srun or salloc)
- erun command or environment variables for not 100% automatic cases

	Use case	Bootstrap	Automatic
MPI	Intel/OpenMPI [+ others]	srun	yes
	Intel [+ others]	mpirun	yes
	OpenMPI [+ others]	mpirun	no : use erun
OpenMP		srun	yes (or use erun)
CUDA		srun	yes (or use erun)
python		srun	yes (or use erun)
Singularity (+any use case)		srun	yes + module or env var support



[https://gitlab.bsc.es/ear\\_team/ear/-/wikis/User-guide#use-cases](https://gitlab.bsc.es/ear_team/ear/-/wikis/User-guide#use-cases)



# Job submission + EAR library options

- Many of the job scripts will work without modification.
- EAR flags in "help"

```
[juliac@int1 ~]$ sbatch --help|grep ear
--ear=on|off          Enables/disables Energy Aware Runtime Library (default OFF)
--ear-policy=type     Selects an energy policy for EAR (monitoring, min_energy, min_time)
--ear-cpufreq=frequency Specifies the CPU frequency to be used by EAR , to be used with monitoring
--ear-user-db=file    Specifies the file to save the job applications metrics (csv format)
--ear-verbose=value   Specifies the level of verbosity (0 default)
```

Memory and GPU frequency also supported with environment variables. See wiki



# Special cases (I)

- **MPI+Python is not transparent**, the user (or the module) should define the MPI version because it cannot be detected.
  - `export EAR_LOAD_MPI_VERSION="open mpi"`
  - `export EAR_LOAD_MPI_VERSION="intel"`
- **Singularity**: EAR can be used but EAR paths and env vars must be exported:  
APPTAINER\_ENV\_XXX, APPTAINER\_BIND
  - `export`  
`APPTAINER_BIND="$EAR_INSTALL_PATH:$EAR_INSTALL_PATH:ro,$EAR_TMP:$EAR_TMP:rw"`
  - `export APPTAINERENV_EAR_INSTALL_PATH=$EAR_INSTALL_PATH`
  - `export APPTAINERENV_EAR_TMP=$EAR_TMP`
  - `export APPTAINERENV_EAR_ETC=$EAR_TMP`



## Special cases (II)

- **OpenMPI**
  - srun recommended
  - use mpirun + erun
- Other use cases/frameworks
  - Force EAR to be loaded with env var
  - export EAR\_LOADER\_APPLICATION="julia"





# Monitoring: EAR metrics

[https://gitlab.bsc.es/ear\\_team/ear/-/wikis/EAR-commands#ear-job-accounting-eacct](https://gitlab.bsc.es/ear_team/ear/-/wikis/EAR-commands#ear-job-accounting-eacct)







# Monitoring

- Jobs executed without EAR library (ear = off) report basic job accounting
  - Job/step/node identification
  - Job/step/node execution time
  - Job/step/node energy consumption
- Jobs executed with EAR library (ear =on) report advanced job accounting
  - Job/step/node identification
  - Job/step/node/dynamic performance metrics (measured by EAR library)
  - Job/step/node/dynamic power metrics (measured by EAR library)
- Data is reported in EAR DB





# How to get application data

1. **With EAR job accounting command `eacct`:** Command line with pre-defined queries. Multiple filters supported
  - a. average
  - b. per node
  - c. runtime
  - d. pre-selected column in stdout or full data in CSV file
2. **Directly from EAR library**
  - a. csv with timestamp included: `--ear-user-db=filename` (prefix for the file)
  - b. Additional report plugins can be used with env var.
    - i. `EAR_REPORT_ADD=plugin1.so:plug2.so`

Example: [https://gitlab.bsc.es/ear\\_team/ear/-/blob/master/src/report/log.c](https://gitlab.bsc.es/ear_team/ear/-/blob/master/src/report/log.c)



# Basic MPI example

```
#!/bin/bash

#SBATCH -p rome
#SBATCH -t 00:15:00
#SBATCH --nodes=1
#SBATCH --exclusive

#SBATCH --output=NPB.%j.out
#SBATCH --error=NPB.%j.err
#SBATCH --job-name=NPB

module load 2023
module load foss/2023a

PROJECT_DIR=/projects/0/energy-course

srun --ntasks=128 $PROJECT_DIR/NPB3.4-MZ-MPI/sp-mz.C.x
```

# Job submission examples

```
#!/bin/bash
#SBATCH --ntasks=YYY
#### EAR=ON will load all the steps with EAR library
#SBATCH --ear=on

mkdir -p logs
# CASE 1: Default: EAR library on because of headers
srun application
# Runtime metrics reported ON
export EARL_REPORT_LOOPS=1
# CASE 2: mpirun + ear-user-db → CSV file
export I_MPI_HYDRA_BOOTSTRAP_EXEC_EXTRA_ARGS="--ear-user-db=logs/app"
mpirun application
# CASE 3: Using srun + ear-user-db → CSV file
srun --ear-user-db=logs/bt.srun application
# CASE 4: Using erun
module load ear
mpirun -n XXXX erun --ear=on --program="application arg1 arg2...argn"
# CASE 5: EAR library off for this steps
srun --ear=off application
```

# eacct: Energy accounting

- SLURM jobid/stepid
- Users can only access its own data
- GPU support is per-cluster, Jobs executed in AMD partition will also show GPU metrics with null values.
- By default, average per job.step metrics: All nodes included. Most metrics are averaged, energy is accumulated.
- Main flags:
  - -l → per node
  - -r → runtime metrics (default is off in snellius. Use `export EARL_REPORT_LOOPS=1`)
  - -c filename → save in CSV format in file

```
[julitac@int3 example]$ eacct -j 1483484
```

JOB-STEP	USER	APPLICATION	POLICY	NODES	AVG/DEF/IMC(GHz)	TIME(s)	POWER(W)	GBS	CPI	ENERGY(J)	GFLOPS/W	IO(MBs)	MPI%	G-POW(T/U)	G-FREQ	G-UTIL(G/MEM)
1483484-sb	julitac	128nodes_16cores	NP	16	2.35/2.60/---	972.00	375.71	---	---	5843040	---	---	---	---	---	---
1483484-1	julitac	128nodes_16cores	MT	16	2.35/2.40/1.47	492.26	373.53	28.44	0.46	2942015	0.0084	250.8	71.7	0.00/---	---	---
1483484-0	julitac	128nodes_16cores	ME	16	2.55/2.60/1.47	460.68	381.00	30.37	0.47	2808271	0.0088	<b>268.2</b>	71.7	0.00/---	---	---

# eacct metrics



- CPU metrics
  - AVG/DEF/IMC(GHz): **Average** CPU frequency, default frequency and average memory frequency. Includes all the nodes for the step. In KHz.
  - TIME(s): Step execution time, in **seconds**.
  - **POWER: Average DC node power. (in Watts).**
  - **GBS: CPU Main memory bandwidth (GB/second). Hint for CPU/Memory bound classification.**
  - **CPI: CPU Cycles per Instruction. Hint for CPU/Memory bound classification.**
  - ENERGY(J): Accumulated node energy. Includes all the nodes. In Joules.
  - **GFLOPS/WATT : CPU GFlops per Watt. Hint for energy efficiency.**
  - IO(MBs) : IO (read and write) Mega Bytes per second.
  - MPI% : **Percentage of MPI time** over the total execution time. It's the average including all the processes and nodes.
- GPU metrics
  - G-POW (T/U) : Average GPU power. Accumulated per node and average of all the nodes.
    - T = Total (GPU power consumed even if the process is not using them).
    - U = GPUs used by the job.
  - G-FREQ : Average GPU frequency. Per node and average of all the nodes.
  - G-UTIL(G/MEM) : GPU utilization and GPU memory utilization.



[https://gitlab.bsc.es/ear\\_team/ear/-/wikis/User%20guide#job-accounting-eacct](https://gitlab.bsc.es/ear_team/ear/-/wikis/User%20guide#job-accounting-eacct)

<https://www.eas4dc.com>

# Tensorflow: GPU application

```
[julitac@int5 ~]$ eacct -j 5687690
```

JOB-STEP	USER	APPLICATION	POLICY	NODES	AVG/DEF/IMC(GHz)	TIME(s)	POWER(W)	GBS	CPI	ENERGY(J)	GFLOPS/W	IO(MBs)	MPI%	G-POW
(T/U)	G-FREQ	G-UTIL(G/MEM)												
5687690-sb	julitac	run_tensor.sh	NP	1	2.43/2.40/---	2612.00	448.98	---	---	1172725	---	---	---	---
5687690-8	julitac	DenseNet121_disa	MO	1	2.38/2.40/2.19	358.55	897.17	2.03	0.66	321685	0.0000	0.1	0.0	257.92 /257.92 1.410 92%/44%
5687690-7	julitac	DenseNet121_mixe	MO	1	2.38/2.40/2.19	189.30	876.59	0.82	0.67	165936	0.0000	0.2	0.0	238.88 /238.88 1.410 80%/52%
5687690-6	julitac	DenseNet121	MO	1	2.38/2.40/2.19	249.38	890.48	0.59	0.66	222070	0.0000	0.1	0.0	251.56 /251.56 1.410 88%/73%
5687690-5	julitac	VGG19_disable-tf	MO	1	2.38/2.40/2.19	646.86	877.18	2.33	0.52	567419	0.0000	0.1	0.0	238.58 /238.58 1.410 98%/26%
5687690-4	julitac	VGG19_mixed	MO	1	2.38/2.40/2.19	248.40	897.64	0.52	0.67	222972	0.0000	0.1	0.0	257.04 /257.04 1.410 96%/51%
5687690-3	julitac	VGG19	MO	1	2.38/2.40/2.19	261.37	907.44	3.21	0.61	237176	0.0000	0.1	0.0	267.94 /267.94 1.410 96%/59%
5687690-2	julitac	ResNet50_disable	MO	1	2.38/2.40/2.19	302.42	920.38	4.22	0.65	278338	0.0000	0.1	0.0	279.54 /279.54 1.410 94%/43%
5687690-1	julitac	ResNet50_mixed	MO	1	2.38/2.40/2.19	149.26	873.35	0.80	0.66	130356	0.0000	0.2	0.0	233.60 /233.60 1.403 84%/50%
5687690-0	julitac	ResNet50	MO	1	2.38/2.40/2.19	196.33	904.09	0.62	0.65	177504	0.0000	0.2	0.0	261.45 /261.45 1.372 87%/70%

# EACCT metrics

- **CPU Bound phases**
  - Very low CPI , Cycles per instruction, (less than 0.5)
  - Low Memory bandwidth (depends on the architecture)
  - Percentage of MPI influences the CPI (MPI waitings are implemented with busy waiting, reduces the CPI)
  - High Gflops
  - Scale linearly with CPU frequency. Not too much opportunities for energy savings
- **Memory bound phases**
  - Medium/High CPI (CPU has to wait for data → increases cycles per instructions)
  - High Memory bandwidth
  - Medium/High Gflops
  - Can take profit of reducing the CPU frequency. Do not scale linearly with CPU frequency



# Job Energy Efficiency metric: CPU jobs

- PUE is the ratio of the total amount of power used by a computer data center facility to the power delivered to computing equipment
  - It's not a job metric!!
- Being energy efficient is not consuming less power, is doing an optimal utilization of the power we consume
- For CPU HPC applications, a traditional metric could be the GFLOPS/Watt
  - GFlops characterize the CPU activity
  - Watts the power consumption
- Not valid for
  - Data intensive jobs
  - Non-CPU intensive jobs

# Job Energy Efficiency metric: GPU jobs

- GPU metrics reported by default (per-GPU)
  - GPU utilization
  - GPU memory utilization
  - GPU frequency
  - GPU power consumption
- GPU Utilization is not representative enough of the GPU activity
  - NVIDIA GPUs provides more metrics, but many of them are ratios (0...1), for example the FP activity
  - Any action on the GPU increases the GPU
  - New EAR version will include GPU

# EACCT metrics: what else can be observed?



- Are nodes homogeneous ? Same signatures in all the nodes (-l )
- Are there phases, is it constant? Are runtime signatures the same? (-r)
- How much time my application is in MPI calls??
- GPU utilization
- Impact on power and performance of changing job configuration
  - Example: Problem with GPU utilization in GROMACS-GPU

```
[julitac@int3 ~]$ eacct -j 1387089
```

JOB-STEP	USER	APPLICATION	POLICY	NODES	AVG/DEF/IMC(GHz)	TIME(s)	POWER(W)	GBS	CPI	ENERGY(J)	GFLOPS/W	IO(MBs)	MPI%	G-POW
(T/U)	G-FREQ	G-UTIL(G/MEM)												
1387089-sb	julitac	rfm_GROMACS_GPU_NP	1	2.35/2.40/---	6634.00	879.52	---	---	5834703	---	---	---	---	---
1387089-2	julitac	rfm_GROMACS_GPU_MT	1	2.35/2.20/2.02	2886.16	803.91	24.39	0.37	2320201	0.0091	0.1	71.0	333.42/333.42	1.409 10%/0%
1387089-1	julitac	rfm_GROMACS_GPU_ME	1	2.35/2.40/2.10	2880.70	847.76	37.46	0.38	2442131	0.0129	0.1	68.1	359.00/359.00	1.409 14%/0%
1387089-0	julitac	rfm_GROMACS_GPU_MO	1	2.38/2.40/2.19	833.64	1260.21	152.87	0.56	1050561	0.0425	0.4	26.4	650.88/650.88	1.409 73%/0%

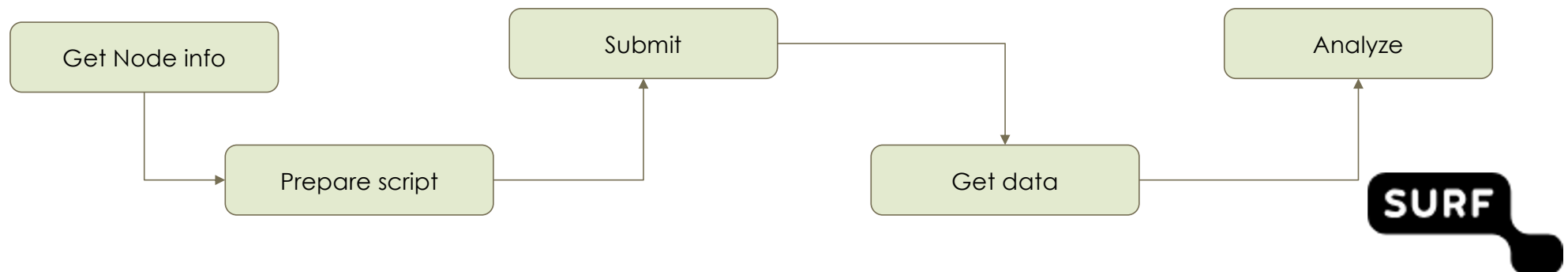


# Energy optimization



# Static energy optimization

- Optimal CPU/Memory/GPU depends on the application, input data, architecture, number of nodes etc etc
- However, you can be interested in applying DVFS in specific case
- With EAS is easy to ask for CPU frequencies
- EAS offers in some architectures more CPU frequencies than available from the OS
- The `enode_info` command reports the EAS technical specification for the computational node





```
$EAR_INSTALL_PATH/bin/tools/enode_info --cpu
EAR CPU info in node tc2
EAR CPU info Topology: cpu_count      : 128
core_count      : 128
socket_count    : 2
..... // CPU details
EAR CPU info load
EAR CPU info API: EARD
EAR CPU info num devices:128
EAR CPU info list of CPU frequencies
PS0: id0, 2600000 KHz
PS1: id1, 2500000 KHz
PS2: id2, 2400000 KHz
PS3: id3, 2300000 KHz
PS4: id4, 2200000 KHz
PS5: id5, 2100000 KHz
PS6: id6, 2000000 KHz
PS7: id7, 1900000 KHz
PS8: id8, 1800000 KHz
PS9: id9, 1700000 KHz
PS10: id10, 1600000 KHz
PS11: id11, 1500000 KHz
EAR CPU info pstate nominal is 0, CPU freq = 2600000 KHz
EAR CPU info governor CPU[0] = conservative
....
EAR CPU info governor CPU[127] = conservative
EAR CPU info curr CPUF[0] = 2601000
..
EAR CPU info curr CPUF[127] = 2601000
```

```
#!/bin/bash
#SBATCH --job-name=sp
#SBATCH --ntasks=128
#SBATCH --ear=on
module purge
module load 2022
module load iimpi/2022a

export OMP_NUM_THREADS=1
export EARL_REPORT_LOOPS=1
srun --ear-policy=monitoring --ear-cpufreq=2500000 ./sp-mz.D.128
srun --ear-policy=monitoring --ear-cpufreq=2400000 ./sp-mz.D.128
srun --ear-policy=monitoring --ear-cpufreq=2300000 ./sp-mz.D.128
srun --ear-policy=monitoring --ear-cpufreq=2200000 ./sp-mz.D.128
```



# Energy policies: Computational phases

- Monitoring:
  - Application analysis
  - Static energy optimization (Manual CPU/Memory/GPU freq selection)
- Minimize energy to solution (min\_energy)
  - EAR **reduces CPU frequency** to save energy with a maximum time penalty
  - Applications start at default frequency and CPU frequency is (potentially) reduced
  - default frequency = nominal frequency
  - Memory frequency selected with a linear search
- Minimize time to solution (min\_time)
  - EAR **increases CPU frequency** to minimize time for “*frequency efficient*” codes
  - Applications that scale well with CPU frequency
  - Default frequency = lower than nominal frequency
  - Application will never run at CPU frequency below the default CPU frequency
  - Memory frequency selected with a linear search

## Common to both policies

- GPU optimization when GPU idleness.
  - IO phases detected.
  - Turbo can be enabled if configured and CPU bound application.
  - Intra-node Load balance .
- 
- GPU frequency selection:
    - Maximum if GPU utilization > 0
    - Minimum if GPU utilization == 0 (power consumption is lower.)



```
sbatch --ntasks=192 --partition=genoa sp.D.sh
sbatch --ntasks=192 --partition=genoa -ear-policy=min_energy sp.D.sh
```



KERNEL SP-MZ.D : ROME (Min\_energy vs Nominal): Must be the same node for comparison

```
[julitac@int5]$ eacct -j 4896747.0
```

JOB-STEP	USER	APPLICATION	POLICY	NODES	AVG/DEF/IMC(GHz)	TIME(s)	POWER(W)	GBS	CPI	ENERGY(J)	GFLOPS/W	IO(MBs)	MPI%	G-POW (T/U)	G-FREQ	G-UTIL(G/MEM)
4896747-0	julitac	sp	ME	1	<b>2.16/2.60/1.47</b>	<b>336.75</b>	<b>457.62</b>	197.79	0.69	<b>154102</b>	2.9608	0.0	12.0	0.00/---	---	---

```
[julitac@int5]$ eacct -j 4896738.0
```

JOB-STEP	USER	APPLICATION	POLICY	NODES	AVG/DEF/IMC(GHz)	TIME(s)	POWER(W)	GBS	CPI	ENERGY(J)	GFLOPS/W	IO(MBs)	MPI%	G-POW (T/U)	G-FREQ	G-UTIL(G/MEM)
4896738-0	julitac	sp	MO	1	<b>2.57/2.60/1.47</b>	<b>329.67</b>	<b>519.01</b>	202.73	0.79	<b>171103</b>	2.6666	0.0	11.0	0.00/---	---	---





# Thanks!

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Benjamin Czaja ([benjamin.czaja@surf.nl](mailto:benjamin.czaja@surf.nl))





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