

## Topics



- EAR overview
- Running jobs with EAR
- Job Monitoring
- Static energy optimization
- Dynamic energy op
- EAR Data visualization with Grafana





# EAR overview

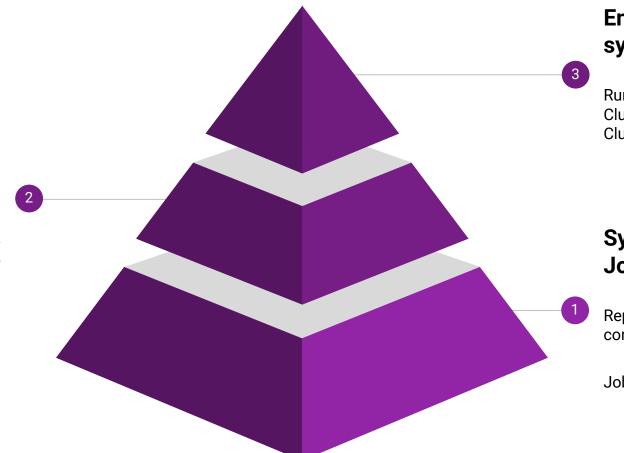


# What's EAR: System software for energy management and optimization



# Powerful application performance and power monitoring

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



# **Energy-efficient** system

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

# System monitoring and Job Accounting

Reports system power consumption

Job energy accounting





### What EAR can do for you?





**Evaluate** my app



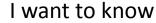
Understand my app



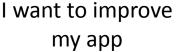
Optimize my app



0 effort



I want to





Submit Job



Energy efficient

ISC2024 EAR to





Energy efficient



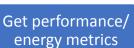
Get performance/ energy metrics



understand

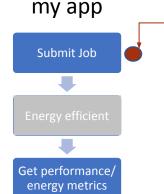
















Be energy efficient





Use EAR



Be efficient!





### EAR architecture



#### Cluster

- monitoring
- Optimization
- Power limits

EAR Cluster power manager

DB

EAR DB Manager

EAR DB Manager

Application

EARLib

EARD

CPU GPU

Application

EARLib

EARD

CPU GPU

Application

EARLib

EARD

Application

EARLib

EARD

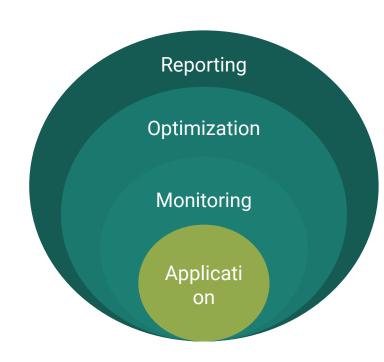
Job Optimization, monitoring, power limits







- 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



Loop detection/Time guided

Report runtime Signature Runtime Signature computation

- Monitoring
  - Runtime loop detection (MPI only).
  - o 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.)

Select CPU/Memory/GPU frequency

Phases Classification

Apply energy models

Computational phase

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

Specific Frequency settings



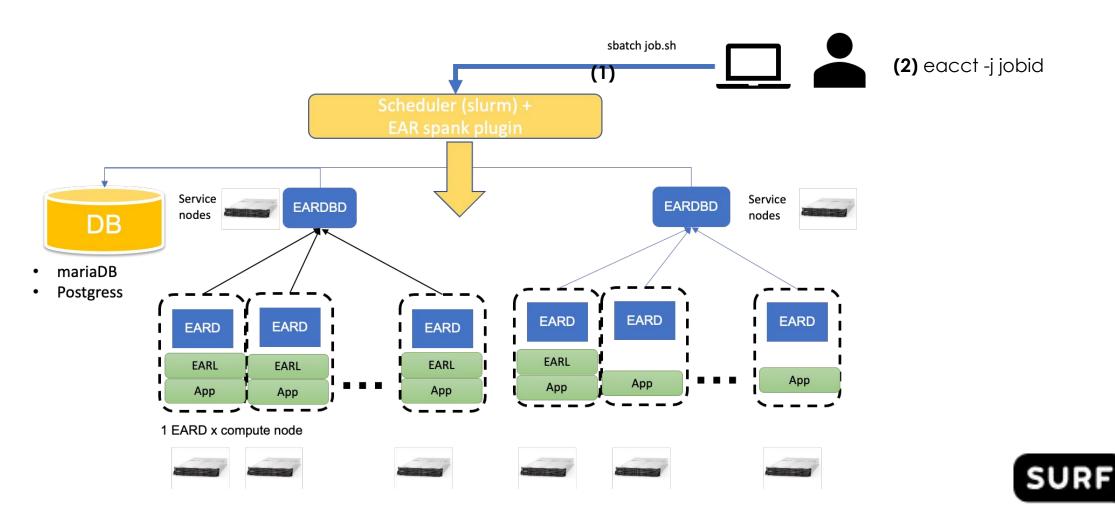


# Running jobs with EAR





### 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



### EAR Library job submission options

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

#### [julitac@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 start 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)







- 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







#### OpenMPI

- srun recommended
- o 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





### 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

- 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: <a href="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</a>





### 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 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:
  - $\circ$  -I  $\rightarrow$  per node
  - -r → runtime metrics (default is off in snellius. Use export EARL\_REPORT\_LOOPS=1
  - o -c filename → save in CSV format in file

```
[julitac@int3 example]$ eacct -j 1483484
               APPLICATION POLICY NODES AVG/DEF/IMC(GHz) TIME(s) POWER(W) GBS CPI
JOB-STEP USER
                                                                                    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
                                                                                               0.0084 250.8 71.7 0.00/---
                  128nodes 16cores MT 16 2.35/2.40/1.47 492.26
                                                                  373.53 28.44 0.46 2942015
1483484-1
           julitac
1483484-0 julitac 128nodes 16cores ME 16 2.55/2.60/1.47 460.68
                                                                  381.00 30.37 0.47 2808271
                                                                                               0.0088 268.2 71.7 0.00/---
```



### eacct 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.
  - o 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.





### Tensorflow: GPU application

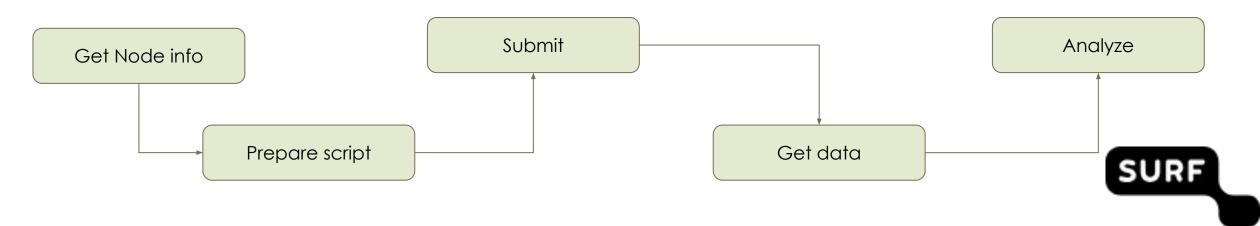
```
[julitac@int5 ~]$ eacct -j 5687690
 JOB-STEP USER APPLICATION
                                 POLICY NODES AVG/DEF/IMC(GHz) TIME(s) POWER(W) GBS CPI ENERGY(J) GFLOPS/W IO(MBs) MPI% G-POW
(T/U) G-FREQ G-UTIL(G/MEM)
5687690-sb julitac run tensor.sh NP 1 2.43/2.40/--- 2612.00 448.98 --- --- 1172725
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%
                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%
5687690-7
         iulitac
5687690-6
         iulitac
                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%
                VGG19 mixed MO 1 2.38/2.40/2.19 248.40 897.64 0.52 0.67 222972
5687690-4
                                                                                       0.0000 0.1 0.0 257.04 /257.04 1.410 96%/51%
         iulitac
5687690-3
         iulitac VGG19
                                     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
                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%
         julitac
5687690-1
         iulitac
                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%
                ResNet50
                                     2.38/2.40/2.19 196.33 904.09 0.62 0.65 177504
5687690-0
         iulitac
                                                                                    0.0000 0.2 0.0 261.45 /261.45 1.372 87%/70%
```





## 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 EAR is easy to ask for CPU frequencies
- EAR offers in some architectures more CPU frequencies than available from the OS
- The enode\_info command reports the EAR technical specification for the computational node



```
$EAR INSTALL PATH/tools/enode info --cpu
EAR CPU info in node tcn2
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 <u>energy</u> 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 <u>time</u> 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 (ME vs MO): Must be the same node for comparison





### Visualization with Grafana

- Steps to use EAR data are in grafana with CSV are
  - Have a local grafana installation with CSV plugins supported
  - Export EAR application data in csv format using eacct (-I -c option) or –ear-user-db flag
  - Export EAR application runtime data in csv format using eacct (-r -c option) or -ear-user-db flag
  - Add a source data based on a local file (Public folder)
    - julita.corbalan\$ cp tensorflow.csv ear\_data\_apps.csv
    - julita.corbalan\$ cp tensorflow\_loops.csv ear\_data\_loops.csv
  - Import the EAR ison file with the dashboards for data visualization
    - "EAR job data visualization.json"
  - Reload the dashboards



