



## Thermodynamics challenges of HPC and AI

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**Computation, thermodynamics and environmental impact**



The Qarnot approach: reusing the computation heat



Where is research heading?

# HPC environmental impact

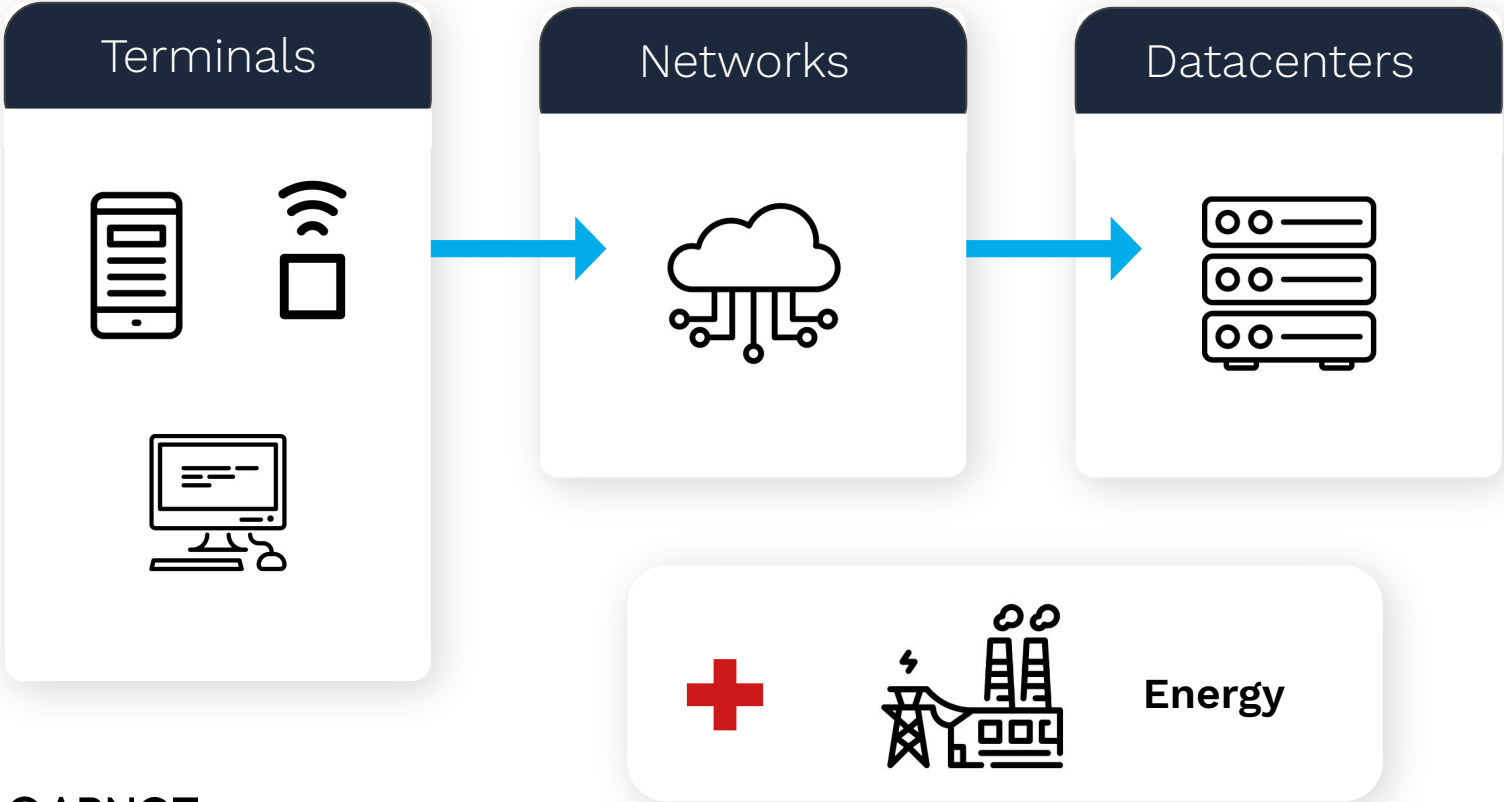
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Are cloud infrastructures as light as this cloud?



# HPC environmental impact

Important infrastructures behind cloud services



# HPC environmental impact

## Important infrastructures behind cloud services



# HPC environmental impact

## Important infrastructures behind cloud services



**1,600** million tons of  
CO2 per year



**4%+** of global carbon footprint  
More than the aviation industry



**9%** yearly increase

Source: [Lean ICT - Towards sobriety](#) - The Shift Project - March 2019

# Hidden costs of computation

## #1 Cooling system

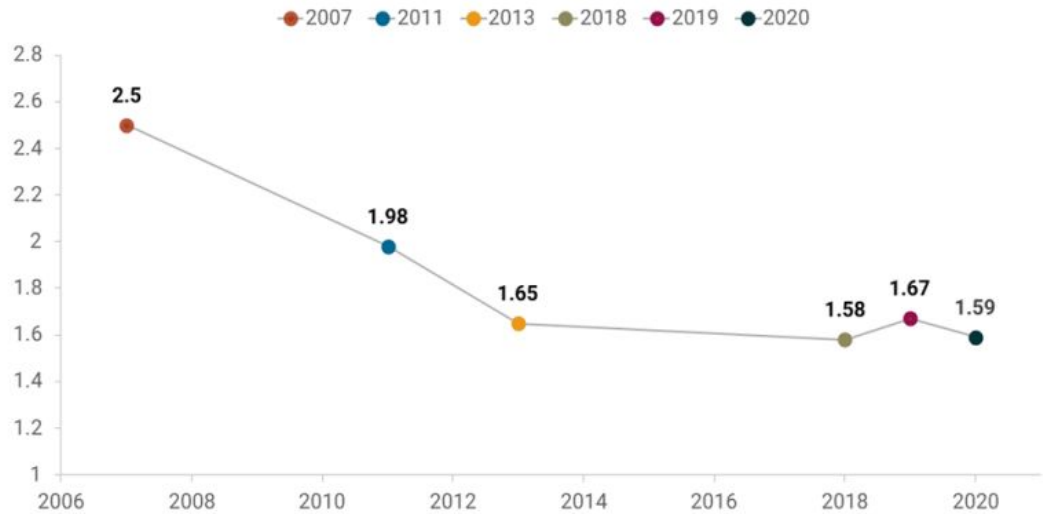
# PUE

Power Usage Effectiveness

$$\frac{\textit{EnergyIT} + \textit{EnergyCooling} + \textit{EnergyMisc}}{\textit{EnergyIT}}$$

# Hidden costs of computation

## #1 Cooling system



Source: Reported data center PUE figures in global Uptime Institute surveys from 2007 to 2020

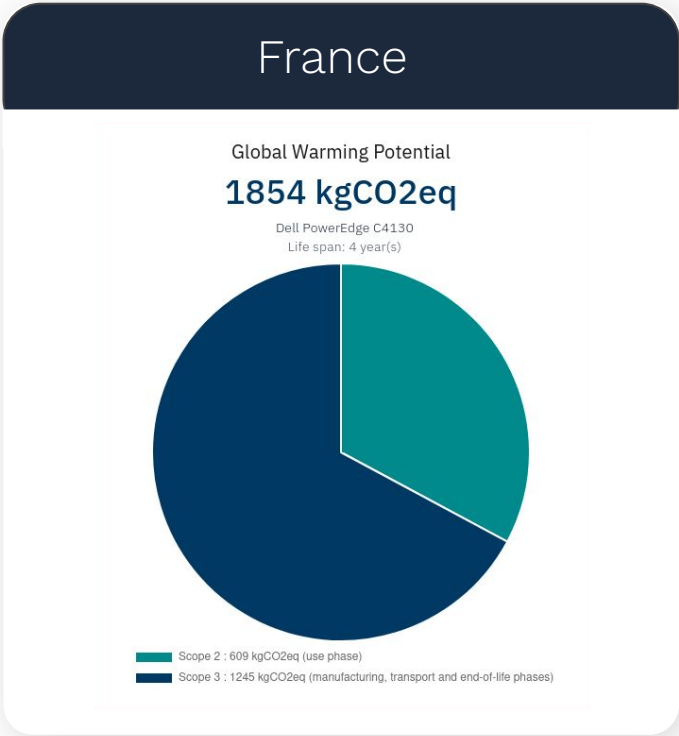
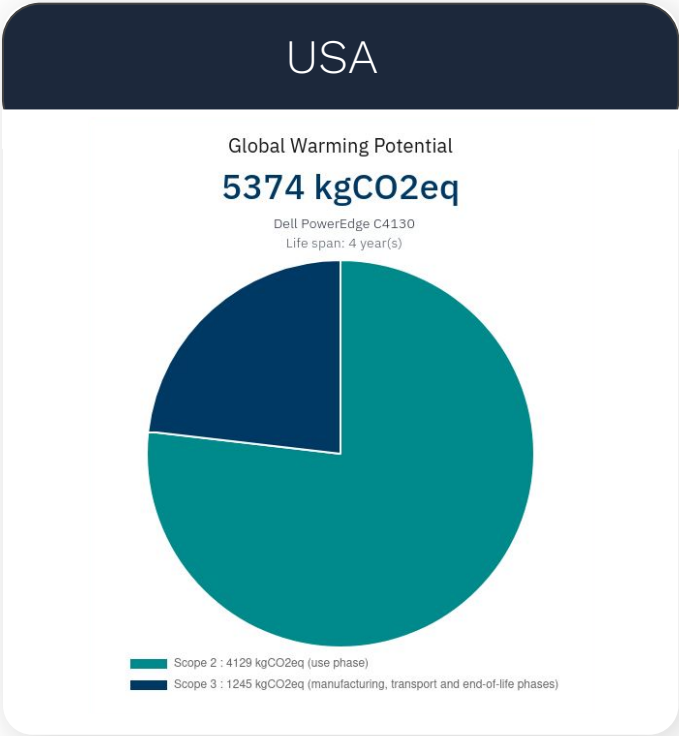
UptimeInstitute® | INTELLIGENCE



# Hidden costs of computation

## #2 Fabrication

Usage  
Manufacturing



# A focus on AI

## GPT - Evaluation #1



GPT-3 (175B) training

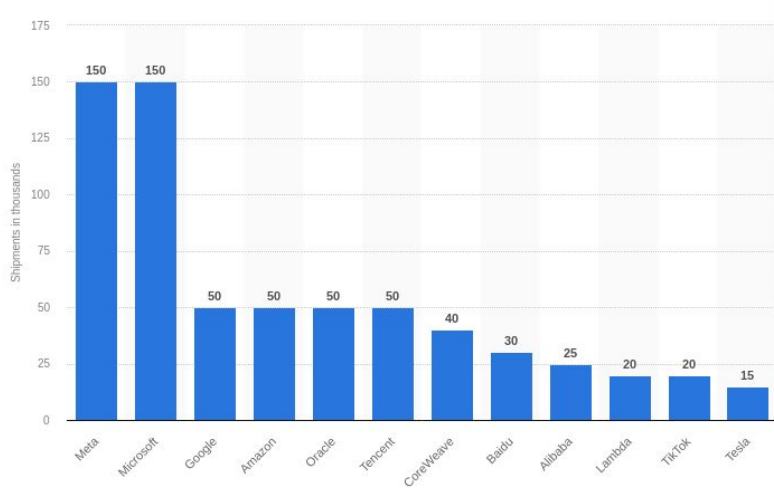
**~500 tCO<sub>2</sub>eq**

*Without inferencing  
Without fabrication*

**Is it a lot?**

# A focus on AI

## GPT - Evaluation #2



**Estimated shipments of Nvidia H100 GPUs  
worldwide in 2023**

### Parameters

**500k+** GPUs shipped

**700W** TDP

**x2** factor for server and DC

**0,52 gCo<sub>2</sub>eq/Wh** US mix

### Carbon computation

~ 500 000 \* 700 \* 2 \* 1/2 year

~ 3,1 TWh

~ **1,6 M tCO<sub>2</sub>**

~ **2\*10<sup>6</sup> AR Paris - NYC**

*Without inferencing*

*Without fabrication*

*Without other GPUs sold this year and before*

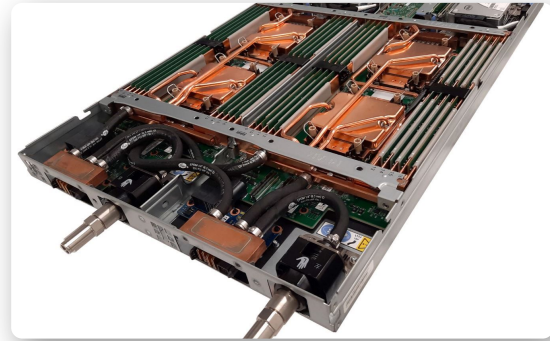
## Beyond carbon footprint

**Environmental footprint =**  
**carbon footprint**  
**+ water usage**  
**+ abiotic depletion**  
**+ ...**

Water usage



Abiotic depletion





Computation, thermodynamics and environmental impact



**The Qarnot approach: reusing the computation heat**



Where is research heading?

# A hybrid approach

## Two complementary industries



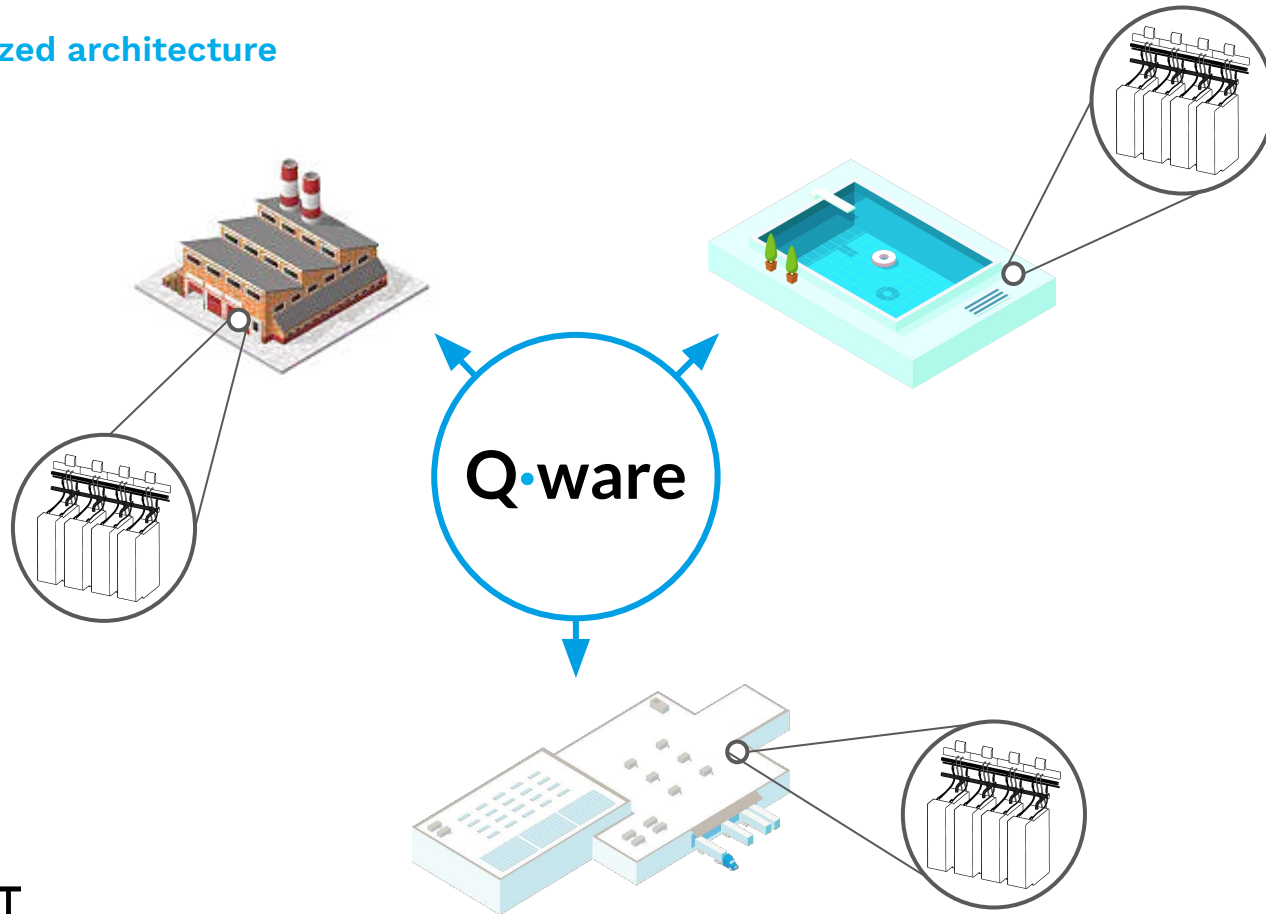
Cooling system of a data center  
*Google, Oregon, 103 MW*



Heating system of a heat network  
*Sweden, 30 MW*

# A hybrid approach

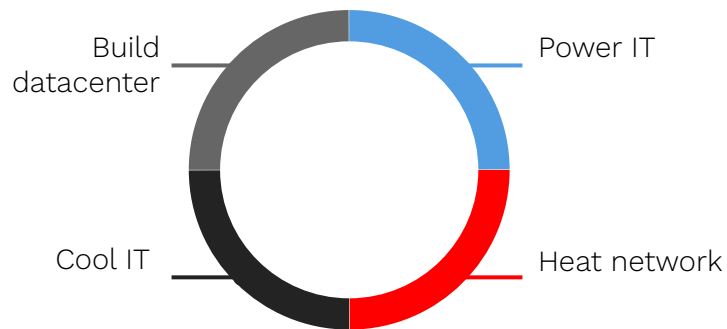
## A decentralized architecture



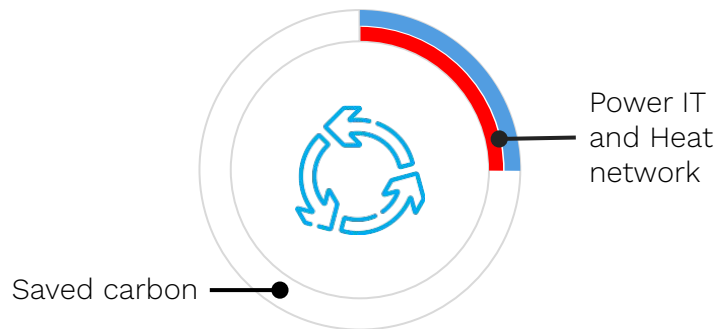
# A hybrid approach

No new building, no cooling, and waste heat reused

## Traditional model



## Qarnot model





A hybrid approach

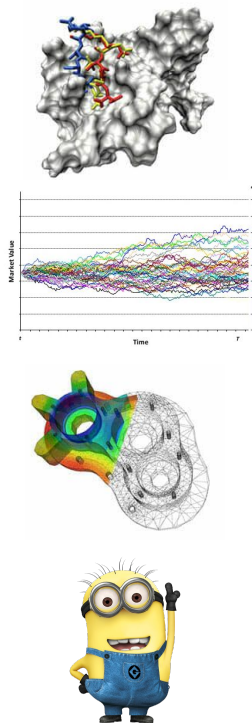
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Business challenge #1: A new metric, the ERE

# ERE

*Energy Reuse Effectiveness*

$$\frac{\text{EnergyIT} + \text{EnergyCooling} + \text{EnergyMisc} - \text{EnergyReused}}{\text{EnergyIT}}$$



# QARNOT

## Computing

*Clients who need  
computing power*



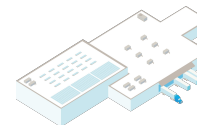
# QARNOT

## Building

*Clients who need heat*

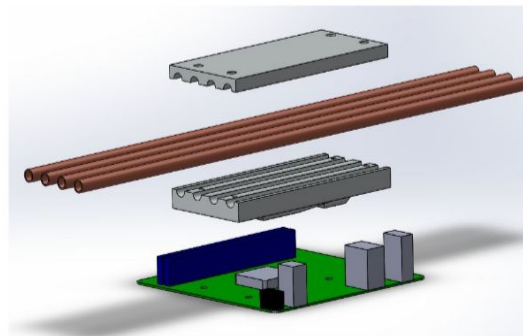


Computing boiler



# A hybrid approach

## Business challenge #2: A new hardware: the computing boiler





Computation, thermodynamics and environmental impact



The Qarnot approach: reusing the computation heat



**Where is research heading?**

## Emerging research axes

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### **Evaluation**

Measure, simulate

### **Efficiency**

Optimize systems: same usage, reduced footprint

### **Sobriety**

Redefine usages

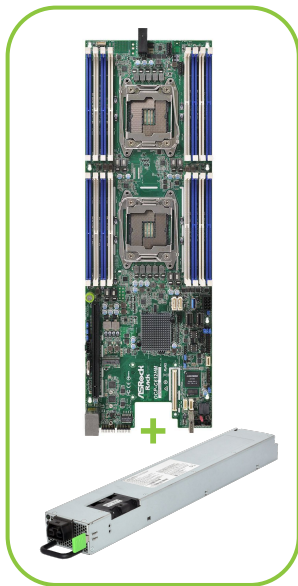
### **Resiliency**

Define systems that help facing partial breakdowns

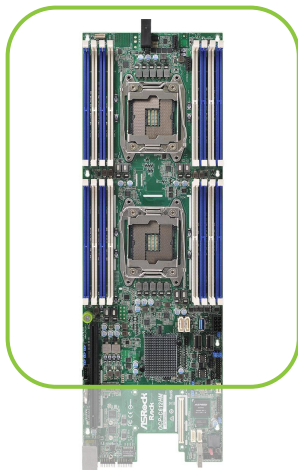
# Emerging research axes

Evaluation: how to manage heterogeneous instrumentation?

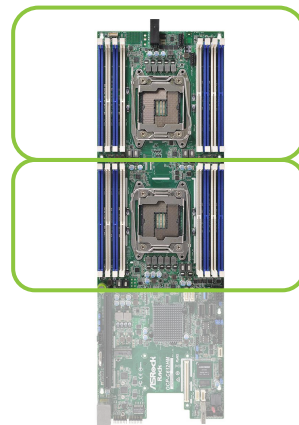
**Wattmeter**



**BMC**



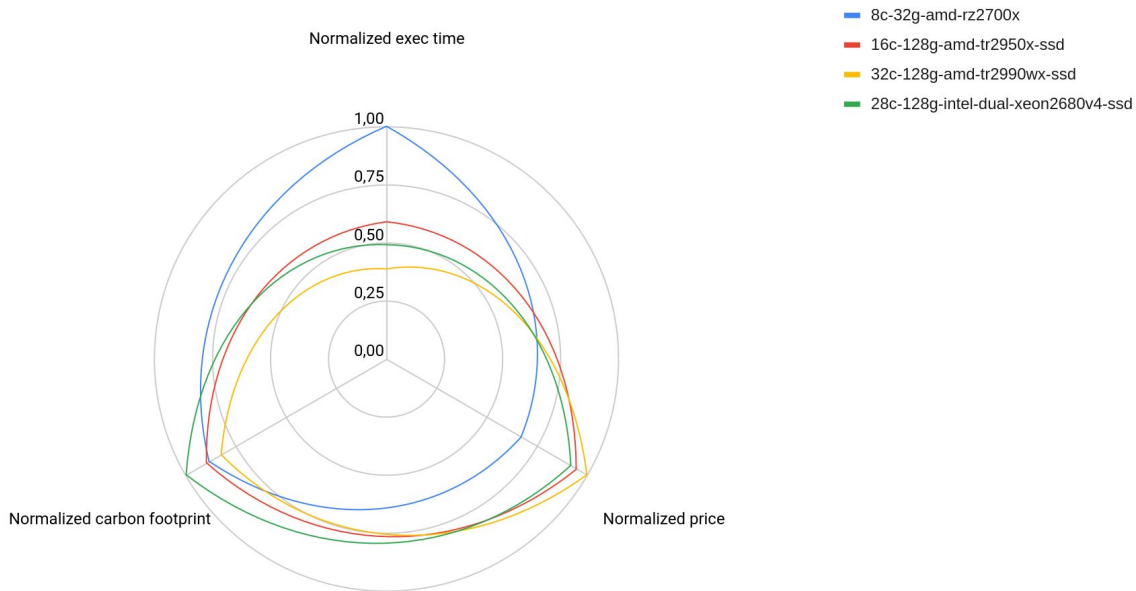
**RAPL**



# Emerging research axes

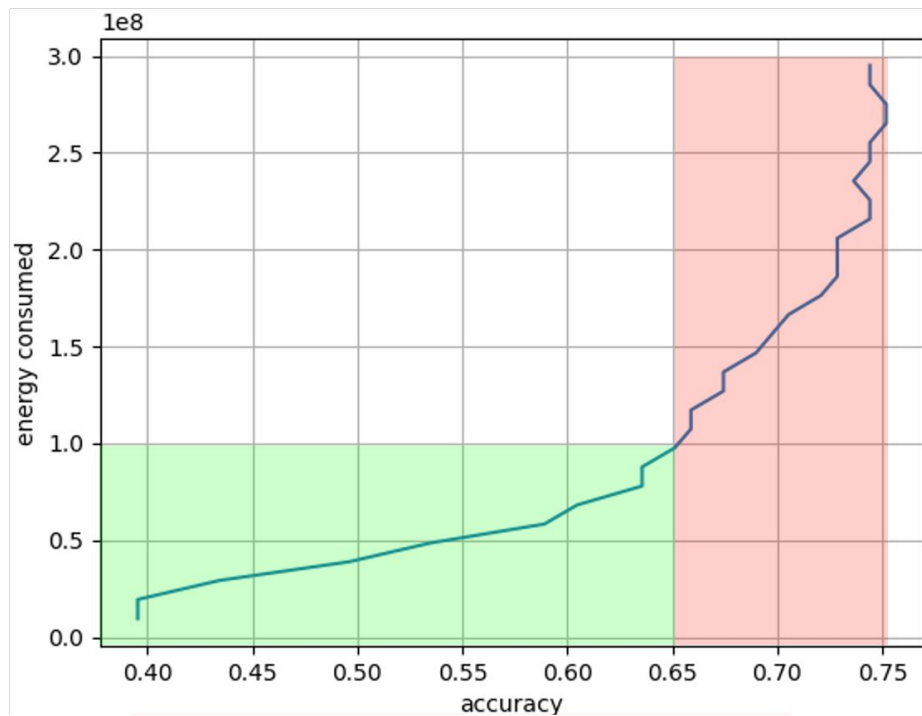
## Efficiency: how to include environmental parameters in the scheduling policy

gromacs (biotech)



# Emerging research axes

**Sobriety: when should we stop a training?**





Questions ?



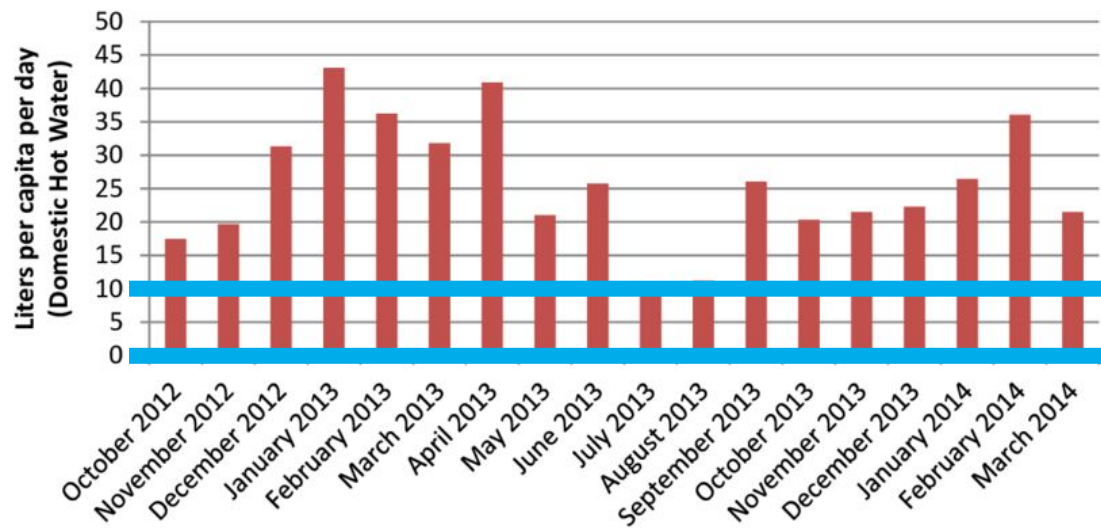
**Thank you for  
your attention!**



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## Bonus - QB·x

How do you do in the summer?



# Bonus - Carbon facts

Carbon Facts	
Name	Using a QBx during a year
Duration	365d
Saved Carbon Footprint	17.11 <sub>TCO<sub>2</sub>e</sub>
Saved carbon footprint %	88.4 <sub>%</sub>
Energy	
Total consumed energy	39.48 GWh
Reused energy	37.15 GWh
PUE (Power Usage Effectiveness)	1.001
ERE (Energy Reuse Effectiveness)	0.06
ERF (Energy Reuse Factor)	94.1 %
Carbon	
Qarnot carbon footprint	2.25 TCO <sub>2</sub> e
Equivalent European data center carbon footprint	10.92 TCO <sub>2</sub> e
Saved carbon footprint   compute service	8.67 TCO <sub>2</sub> e
Saved carbon footprint   heat service	8.43 TCO <sub>2</sub> e
Saved carbon footprint   compute + heat services	17.11 TCO <sub>2</sub> e
Saved carbon footprint %	88.4 %
Water	
WUE (Water Usage Effectiveness)	0 L/kWh