

# Sustainability Aspects in Supercomputing

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# Outline



Sustainability Aspects of Supercomputing



What is Energy Efficiency?

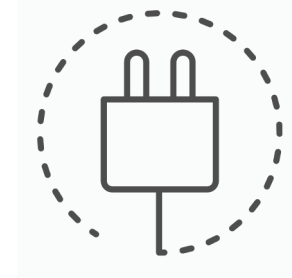


How to improve Energy Efficiency & Have Less Environment Impact

# 1. Sustainability Aspects of Supercomputing

# With Great (Computing) Power Comes Big Responsibility

- Supercomputers have become critical tools for scientific research, data analysis, and other applications that require **massive amounts of computing power**.
- However, these powerful machines also come with **several sustainability issues**.



# Sustainability Issues with Supercomputing



High Power  
Consumption



Carbon Emissions



Heat Generation



Limited Lifespan /  
E-waste



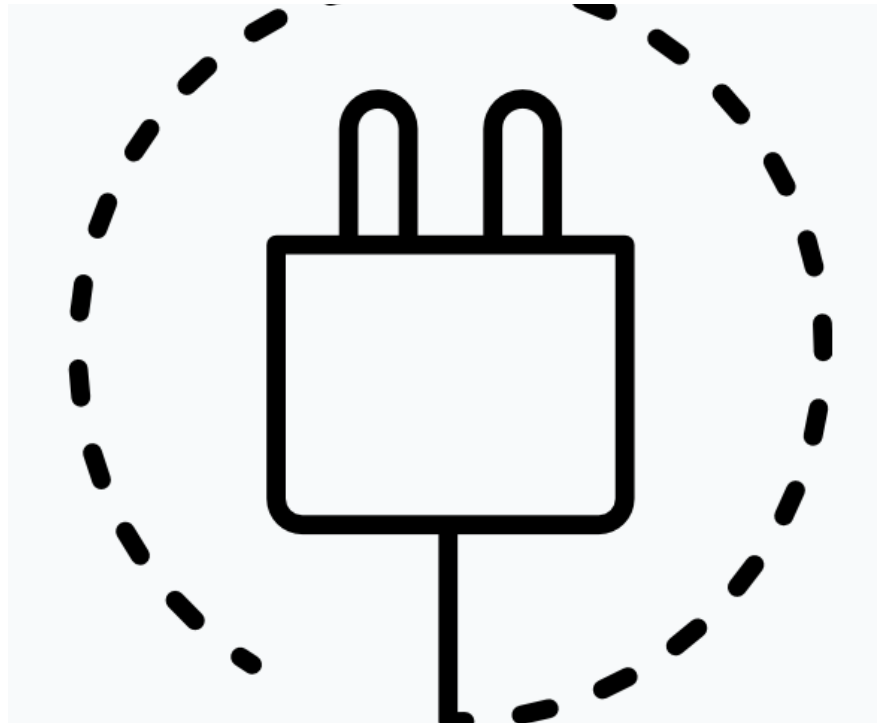
Resource Intensive  
Manufacturing &  
Logistics



Water Usage

# High-Power Consumption

- Supercomputers, especially large-scale ones, consume massive amounts of electrical power.
- This high power demand contributes to increased energy costs, carbon emissions, and strains on electrical grids.



# Power Consumption - Supercomputers

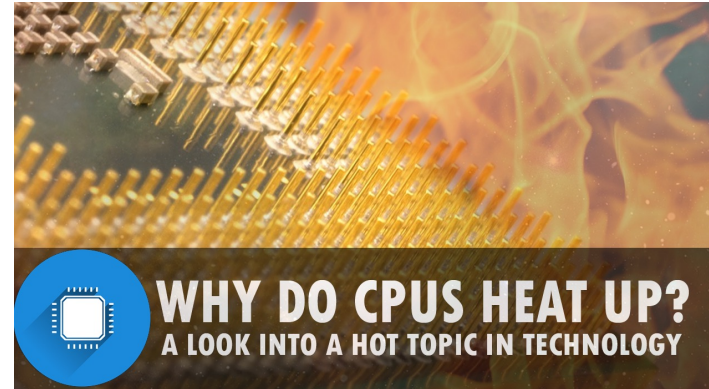
Supercomputers require **massive amounts of energy** to operate, which can lead to significant environmental impact and increased energy costs.

Require Electricity for two things:

1. **Calculations** ← Electricity

*Heat is a major, if not the only, result of the calculations 😊*

2. **Remove Heat** ← Electricity



Courtesy: <https://centralvalleycomputerparts.com/articles/why-do-cpus-get-hot/>

# The Top500 List - <https://top500.org/lists/top500/2024/06/>

| Rank | System  | Cores     | Rmax<br>(PFlop/s) | Rpeak<br>(PFlop/s) | Power<br>(kW) |
|------|---|-----------|-------------------|--------------------|---------------|
| 1    | <b>Frontier</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE<br>DOE/SC/Oak Ridge National Laboratory<br>United States                  | 8,699,904 | 1,206.00          | 1,714.81           | 22,786        |
| 2    | <b>Aurora</b> - HPE Cray EX - Intel Exascale Compute Blade, Xeon CPU Max 9470 52C 2.4GHz, Intel Data Center GPU Max, Slingshot-11, Intel<br>DOE/SC/Argonne National Laboratory<br>United States | 9,264,128 | 1,012.00          | 1,980.01           | 38,698        |

→ 22 MW!

→ 38 MW!  
Can't start all the system!

114 **Dardel GPU** - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE  
KTH - Royal Institute of Technology  
Sweden

|   |   |           |        |        |       |
|---|---|-----------|--------|--------|-------|
| 5 | <b>LUMI</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE<br>EuroHPC/CSC<br>Finland | 2,752,704 | 379.70 | 531.51 | 7,107 |
|---|---|-----------|--------|--------|-------|

→ European System: relatively power drain

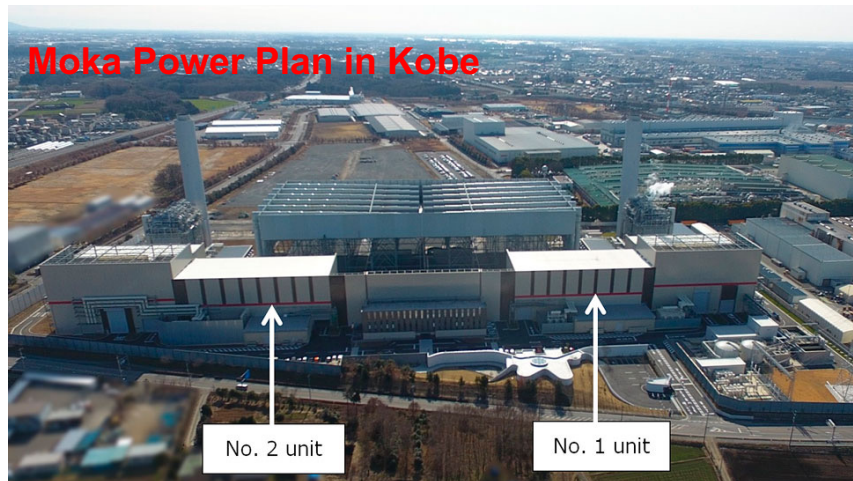


# Power Consumption - Supercomputers

Frontier #1: 22 MW  
Aurora #2: 38 MW  
Fugaku #4: 29 MW  
LUMI #5: 7 MW

The power usage of a small town can range from a few MW to tens of MW.

Power stations provide approx. GW.

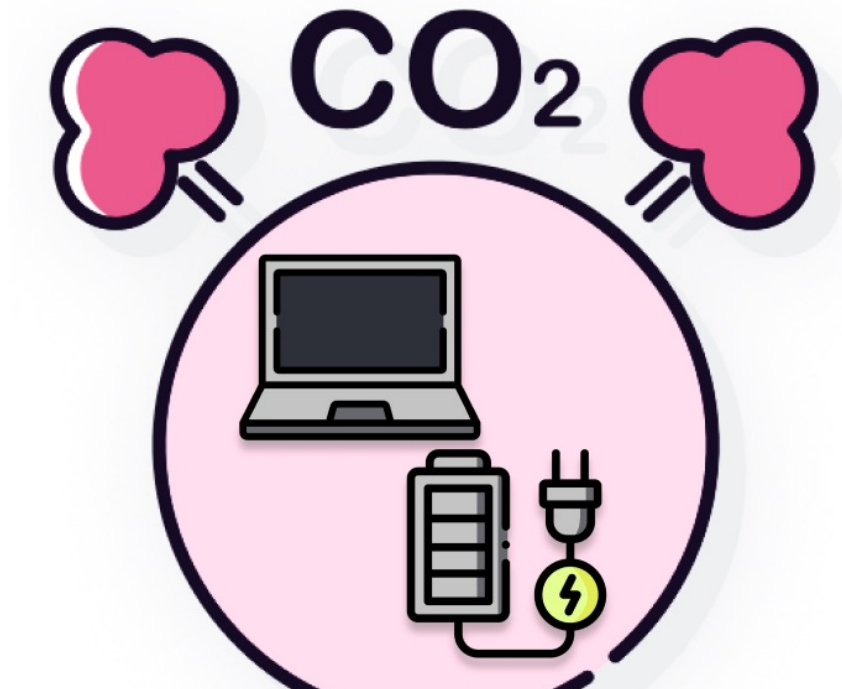


| Company name              | Kobelco Power Kobe, Inc.                   | Kobelco Power Moka, Inc.                          | Kobelco Power Kobe No. 2, Inc.             |
|---------------------------|--|---|--|
| Location                  | Kobe, Hyogo Prefecture (within Kobe Works) | Moka, Tochigi Prefecture (adjacent to Moka Plant) | Kobe, Hyogo Prefecture (within Kobe Works) |
| Fuel                      | Coal                                       | City gas  | Coal                                       |
| Power generation capacity | 1,400 MW (700 MW x 2 units)                | 1,248 MW (624 MW x 2 units)                       | 1,300 MW (650 MW x 2 units)                |

Courtesy: [https://www.kobelco.co.jp/english/releases/1203382\\_15581.html](https://www.kobelco.co.jp/english/releases/1203382_15581.html)

# Supercomputing Carbon Footprint

- The carbon footprint refers to the total amount of **greenhouse gas emissions** primarily carbon dioxide CO<sub>2</sub>
  - For supercomputers, this includes the energy used to manufacture, operate, and dispose of the machines.
- The energy used to power supercomputers is typically derived from **non-renewable sources** such as coal, oil, and natural gas, which are major sources of **greenhouse gas emissions**.



# Supercomputing Heat generation

- Supercomputers generate a tremendous amount of **heat during operation**, which must be **dissipated to prevent damage** to the system.
- This can require additional energy to cool the system and contribute to urban heat islands and other environmental concerns.
  - Health hazard

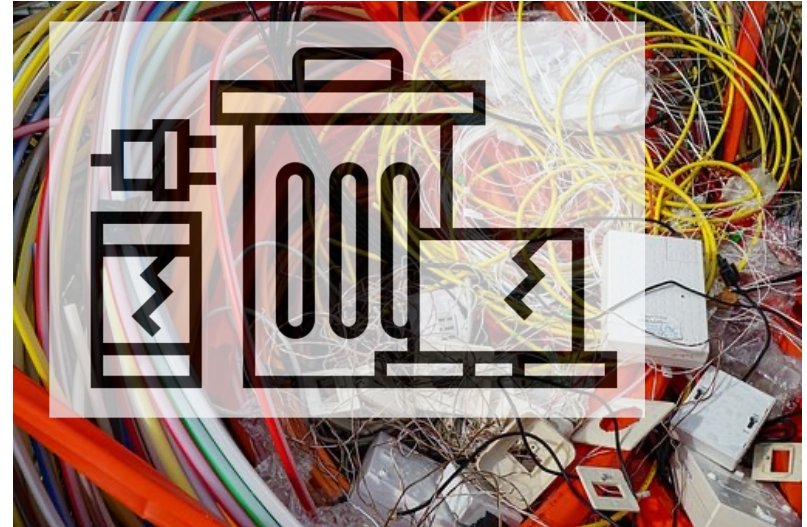


Courtesy: <https://climatekids.nasa.gov/heat-islands/>

# Supercomputer Lifespan & Electronic Waste

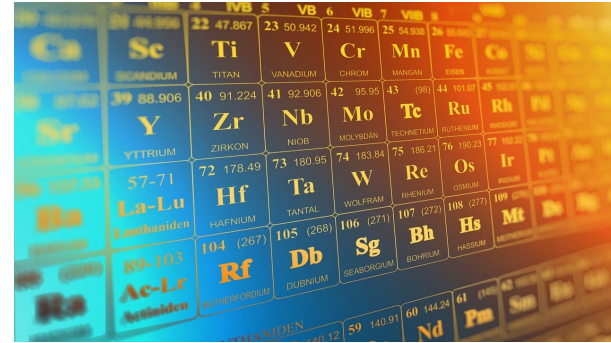
Supercomputers are **often replaced every 5-6 years** (technologies become obsolete and much more efficient technologies), leading to a significant amount of e-waste.

- Many of the components used in supercomputers, such as processors and memory modules, contain **hazardous materials that can pose a risk to the environment if not disposed of properly.**



# Resource Intensive Manufacturing & Supply Chain

- The production of supercomputers requires a significant amount of resources, including **rare earth metals** and other **materials that may be difficult to source sustainably**.
- Additionally, **the production and transport of supercomputers** can contribute to carbon emissions and other environmental impacts.



# Supercomputer Water Usage

- Some cooling methods for supercomputers involve large quantities of water.
- Water usage for cooling, particularly in regions with water scarcity, can be a concern.



Courtesy: <https://www.vistechcooling.co.uk/knowledge-centre/articles/best-practice-for-replacing-cooling-heating-pipework/>



# Reflection & Awareness

- Important to think about the impact of our calculations on the environment
- Paper: <https://onlinelibrary.wiley.com/doi/10.1002/adv.202100707>
- We can evaluate our impact: <http://calculator.green-algorithms.org/>
- Report estimate in your computational work, see example below

The effect of data encoding on the expressive power of variational quantum machine learning models

Maria Schuld,<sup>1</sup> Ryan Sweke,<sup>2</sup> and Johannes Jakob Meyer<sup>2</sup>

<sup>1</sup>Xanadu, Toronto, ON, M5G 2C8, Canada

<sup>2</sup>Dahlem Center for Complex Quantum Systems,  
Freie Universität Berlin, 14195 Berlin, Germany

(Dated: March 10, 2021)

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MS wants to thank Nathan Killoran, Nicolas Quesada and Josh Izaac for helpful discussions. RS and JJM acknowledge funding from the BMWi under the PlanQK initiative. The authors endorse Scientific CO<sub>2</sub>nduct [44] and provide a CO<sub>2</sub> emission table in Appendix D.

## Appendix D: CO<sub>2</sub> Emission Table

### Numerical simulations

|   |       |
|---|-------|
| Total Kernel Hours [h]  | ≈ 100 |
| Thermal Design Power Per Kernel [W]                           | ≈ 50  |
| Total Energy Consumption Simulations [kWh]                    | ≈ 5   |
| Average Emission Of CO <sub>2</sub> In South Africa [kg/kWh]  | ≈ 1.5 |
| Total CO <sub>2</sub> Emission For Numerical Simulations [kg] | ≈ 7.5 |

### Transport

|   |       |
|---|-------|
| Total CO <sub>2</sub> Emission For Transport [kg] | 0     |
| Total CO <sub>2</sub> Emission [kg]               | ≈ 7.5 |
| Were The Emissions Offset?                        | Yes   |

# In-Class Exercise

calculator.green-algorithms.org

Green Algorithms  
*How green are your computations?*

Check out the new Green Algorithms website: [www.green-algorithms.org](http://www.green-algorithms.org)

### Details about your algorithm

To understand how each parameter impacts your carbon footprint, check out the formula below and the [methods article](#)


Runtime (HH:MM)


Type of cores


Number of cores


Model


Memory available (in GB)

**253.64 g CO<sub>2</sub>e**  
Carbon footprint

**2.28 kWh**  
Energy needed

**0.28 tree-months**  
Carbon sequestration

**1.45 km**  
in a passenger car

**0.51%**  
of a flight Paris-London

<https://calculator.green-algorithms.org/>



## 2. What is Energy Efficiency in Supercomputing

# Supercomputing: Understanding Energy Efficiency

- What is Energy Efficiency?
  - Ability of the supercomputer to perform a given amount of computational work while **minimizing its energy consumption**.
    - It's a measure of how effectively the supercomputer uses electrical power to accomplish its tasks
    - Quantified as the **ratio of computational performance** (measured in FLOPS, or floating-point operations per second) **to power consumption** (measured in Watts).



# The Green500 List: Ranking Energy Efficiency

The Green500 list is a ranking of supercomputers based on their energy efficiency and performance in terms of floating-point operations per second (FLOPS).

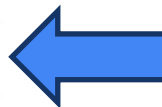
- **Energy Measurement:** This is typically done using power meters or specialized instrumentation that monitors power usage at various points within the supercomputer and its associated infrastructure.
- **Performance Measurement:** The supercomputer's performance is assessed by running the HPL benchmark.



<https://www.top500.org/lists/green500/>

# Green500 List – June 2023

| Rank | TOP500 Rank | System   | Cores   | Rmax (PFlop/s) | Power (kW) | Energy Efficiency (GFlops/watts) |
|------|-------------|--|---------|----------------|------------|----------------------------------|
| 1    | 255         | <b>Henri</b> - ThinkSystem SR670 V2, Intel Xeon Platinum 8362 32C 2.8GHz, NVIDIA H100 80GB PCIe, Infiniband HDR, <b>Lenovo</b> Flatiron Institute<br><b>United States</b>  | 8,288   | 2.88           | 44         | 65.396                           |
| 2    | 34          | <b>Frontier TDS</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE<br>DOE/SC/Oak Ridge National Laboratory<br><b>United States</b>  | 120,832 | 19.20          | 309        | 62.684                           |
| 3    | 12          | <b>Adastra</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE<br>Grand Equipement National de Calcul Intensif - Centre Informatique National de l'Enseignement Supérieur (GENCI-CINES)<br><b>France</b> | 319,072 | 46.10          | 921        | 58.021                           |



|   |    |   |           |          |        |        |
|---|----|---|-----------|----------|--------|--------|
| 4 | 17 | <b>Setonix – GPU</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE<br>Pawsey Supercomputing Centre, Kensington, Western Australia<br><b>Australia</b> | 181,248   | 27.16    | 477    | 56.983 |
| 5 | 77 | <b>Dardel GPU</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE<br>KTH - Royal Institute of Technology<br><b>Sweden</b>                               | 52,864    | 8.26     | 146    | 56.491 |
| 6 | 1  | <b>Frontier</b> - HPE Cray EX235a, AMD Optimized 3rd Generation EPYC 64C 2GHz, AMD Instinct MI250X, Slingshot-11, HPE<br>DOE/SC/Oak Ridge National Laboratory<br><b>United States</b>                         | 8,699,904 | 1,194.00 | 22,703 | 52.592 |



<https://www.top500.org/lists/green500/2023/06/>

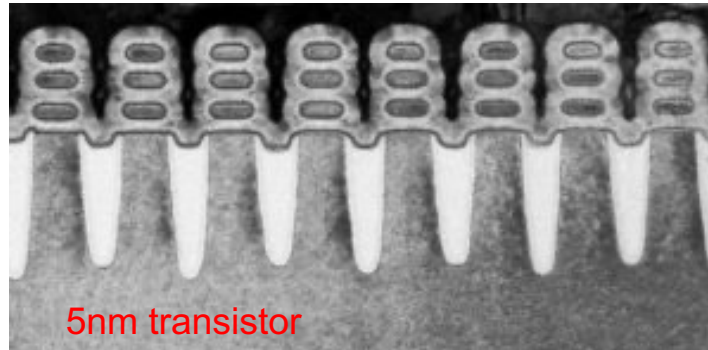
### 3. How to Increase Energy Efficiency & Lower the Impact on the Environment

# Advancements in Energy Efficiency

- The supercomputing industry constantly innovates to enhance energy efficiency.
- Technologies include efficient processors, smart cooling methods, and optimized designs.

# More Energy-Efficient Processors

- Over the last 20 years, significant improvements have been made in developing more energy-efficient leveraging (among others):
  - **Process Technology:** Advancements in semiconductor manufacturing processes, including the transition to smaller nanometer process nodes (e.g., 7nm, 5nm), have improved energy efficiency.
    - **Smaller transistors** are generally more power-efficient because they have lower leakage currents and reduced capacitance.
  - **Multi-Core and Many-Core Architectures:** Increasing the number of processor cores on a chip allows for better workload distribution and energy efficiency for parallelizable tasks.
  - **Heterogeneous Computing:** accelerators are optimized for specific workloads and can significantly improve energy efficiency for parallel and specialized tasks.



Courtesy: <https://cmte.ieee.org/futuredirections/2017/06/08/5nm-transistors/>

# Cooling Methods

- **Air Cooling:**

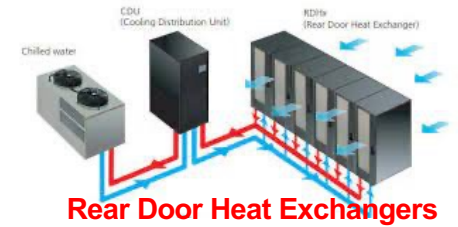
- **Air Conditioning:** Traditional air conditioning systems are used to cool data centers and supercomputing facilities. They remove heat by circulating chilled air through the facility.
- **Hot/Cold Aisle Containment:** In this approach, hot and cold aisles are separated within the data center.

- **Liquid Cooling (Water-based, Mineral Oils, ...):**

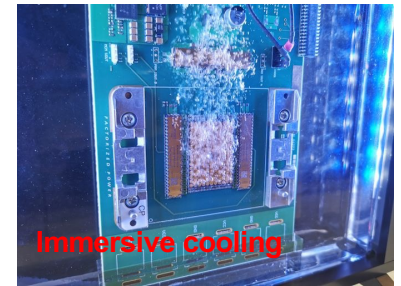
- **Direct-to-Chip Liquid Cooling:** Liquid-cooled systems circulate coolant directly through or around the processors and other high-heat components.
- **Rear Door Heat Exchangers:** Rear door heat exchangers are attached to the back of server racks and use liquid cooling to remove heat from the servers.
- **Immersion Cooling:** In immersion cooling, servers and components are submerged in a non-conductive coolant.



Courtesy : <https://cool-shield.com/aisle-containment-faq/>



Courtesy: <https://www.akcp.com/articles/cooling-with-rear-door-heat-exchanger-to-optimize-data-center/>

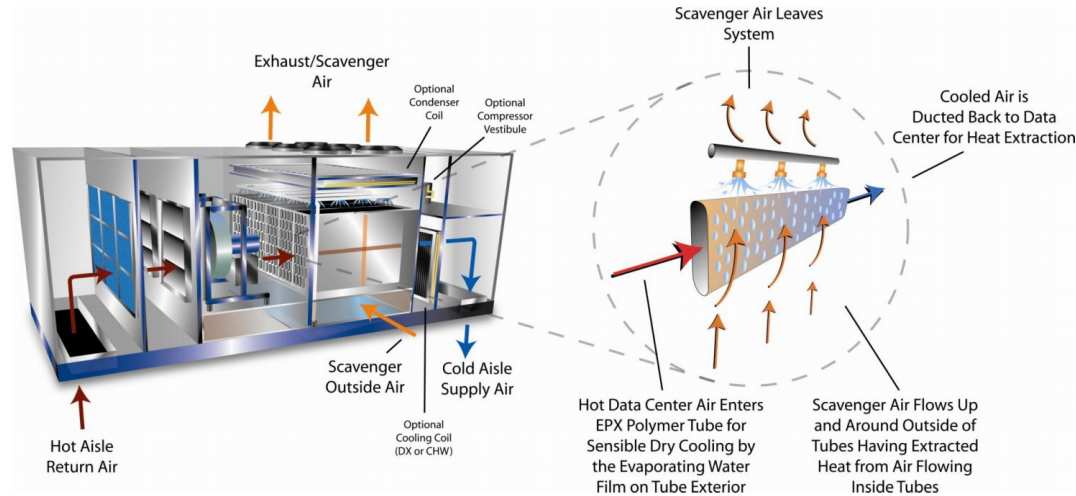


Courtesy: <https://www.anandtech.com/show/15166/two-phase-immersion-liquid-cooling-at-supercomputing-2019>



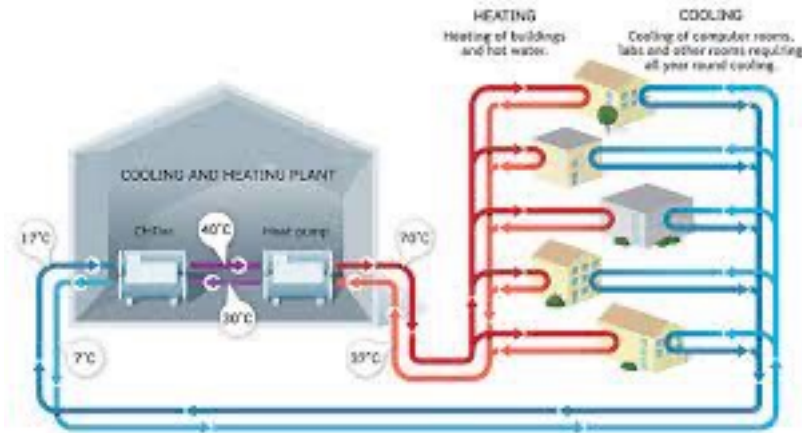
# Free Cooling

- **Outside Air Cooling:** In regions with a suitable climate, outside air can be used for cooling during cooler months.
- Airside economizers draw in outside air to cool the data center, reducing the need for mechanical cooling.



# Sustainability - Heat Reuse

Heat from supercomputers can be used to heat other buildings



*The custom made hood and attached piping on top of Lindgren made it possible to re-use the heat*

# Renewable & Clean Energies to Feed Energy into Computers

- Using **renewable energy sources** to power supercomputers could help reduce their environmental impact.
- Examples:
  - Swiss National Supercomputing Centre (CSCS) - Switzerland:
    - The center is powered by a combination of energy sources, including hydropower, wind, and solar energy.
  - Finnish IT Center for Science (CSC) - Finland:
    - Finland has made a concerted effort to use renewable energy sources for its HPC facilities, and much of the energy comes from wind and hydropower.
  - National Computational Infrastructure (NCI) - Australia:
    - Australia's extensive solar resources have prompted NCI to invest in solar energy to power its computing infrastructure.
- ...



# Conclusion

- Balancing costs and sustainability is a significant challenge in supercomputing.
- The Green500 list and ongoing industry efforts show a path towards responsible and efficient supercomputing.