



# Next-Generation Cooling For NVIDIA Accelerated Computing

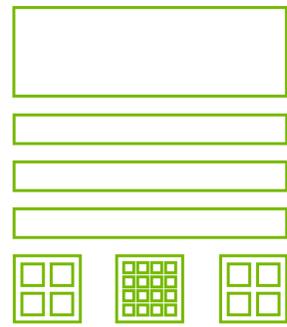
Ali Heydari, Director, Data Center Cooling & Infrastructure

Aug 25, 2024

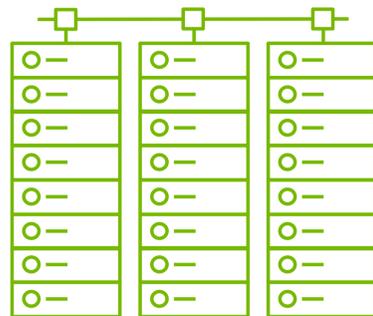
# Era of AI

- The 3 connected dynamics – AI, Accelerated Computing and Data Centers are revolutionizing the way science is done.

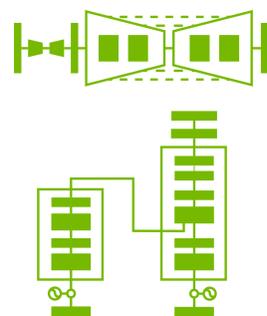
ACCELERATED COMPUTING



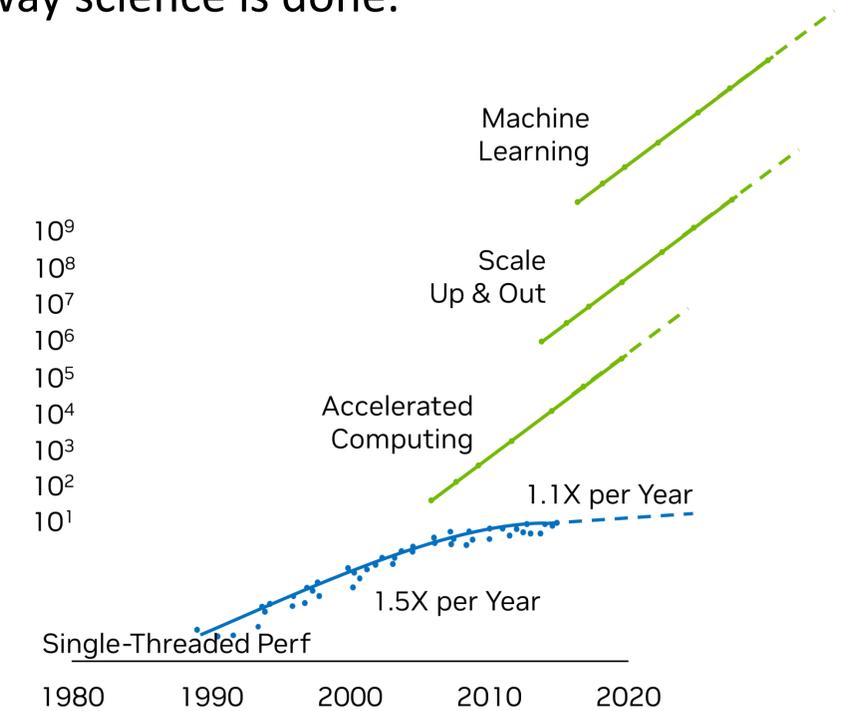
DATA CENTERS



AI

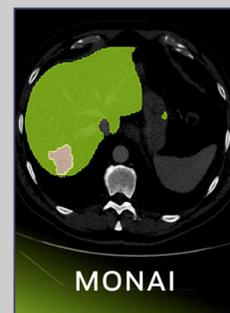
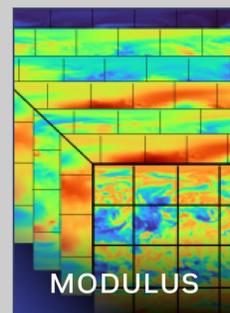


The 3 connected dynamics to give Million-X leap in computations



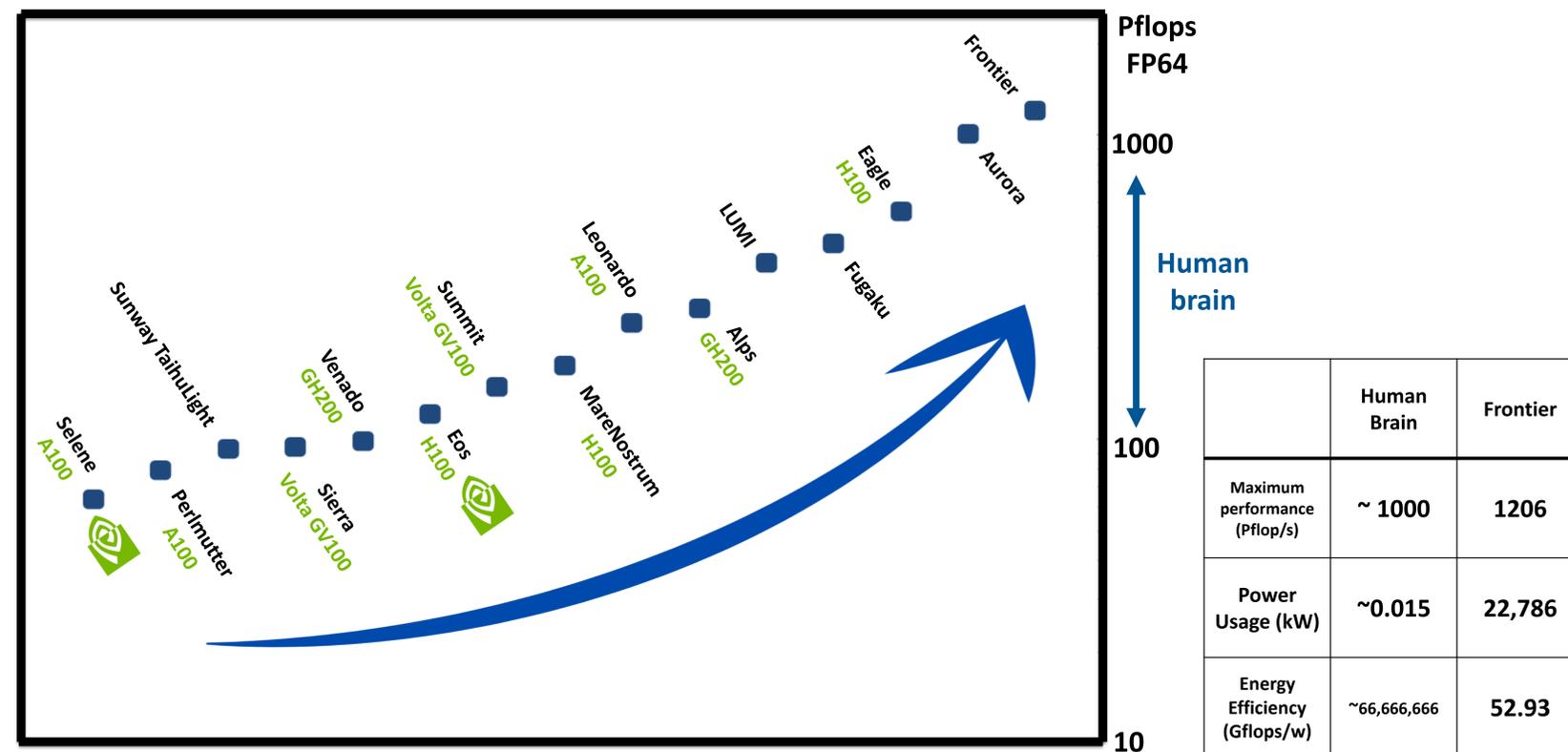
- The million-X leap can solve problems previously impossible, like in the areas of computational fluid dynamics, data science, climate, imaging, computational biology, computational lithography, quantum physics and many more.

## Application Frameworks



# Factories for Generative AI: Data Centers

- Generative AI models to drive the next industrial revolution
- Large AI factories required for:
  - Hosting multiple GPUs with high rack density
  - Providing higher throughput, low latency and running larger AI models in real-time
  - Driving growth in tokens/sec & revenue
- Complexity & scale of modern AI models require significant computational power.
- Multi GPU clusters in AI factories are the future for producing AI tools.
- Liquid Cooling to enable NVIDIA's next-gen chips like **Blackwell** push boundaries in both training and inference



## Building Bigger AI factories

### Selene 2021

4,480 A100 GPUs  
3 EF AI Compute  
112 TB/s BW

### EOS 2023

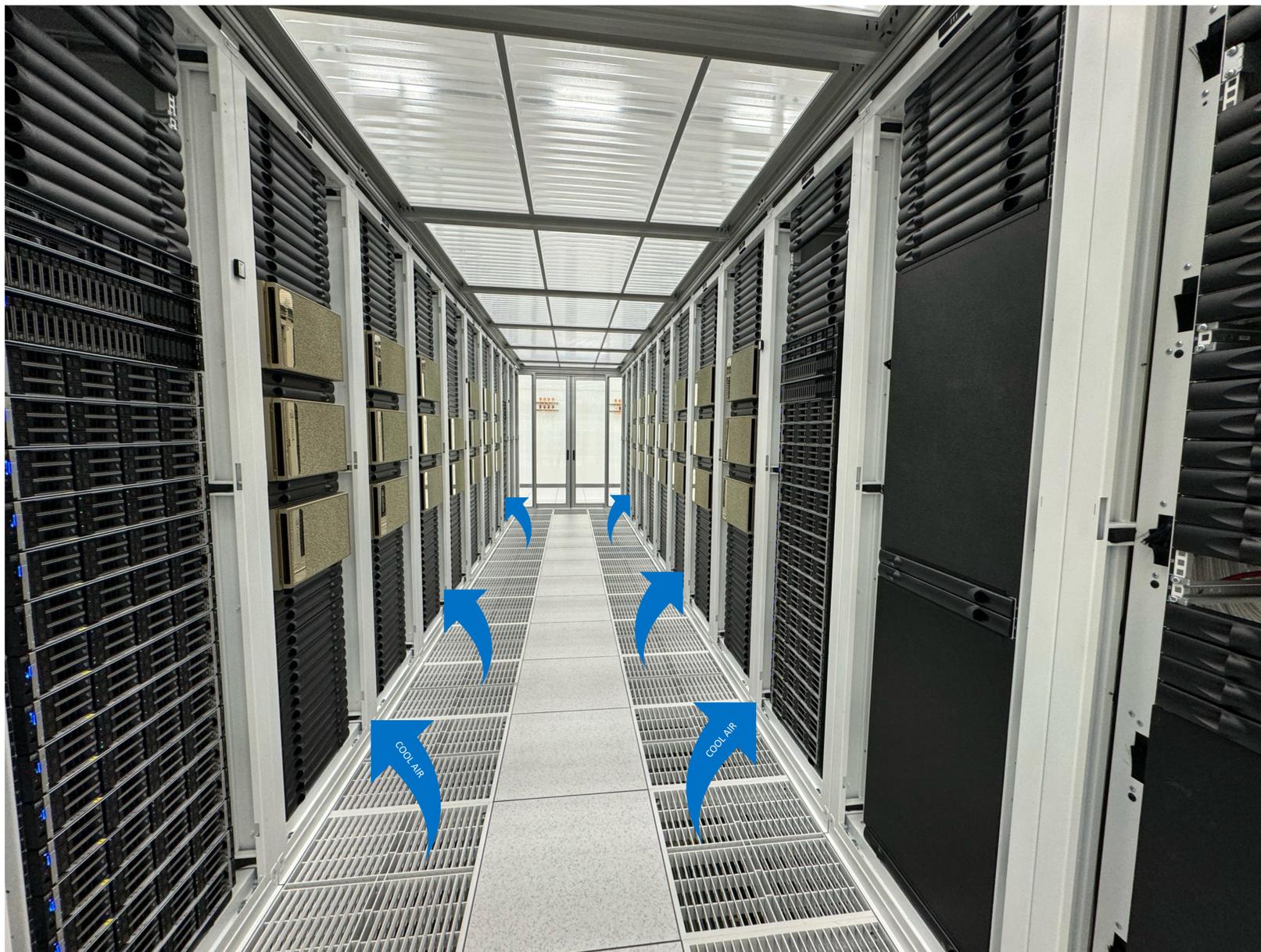
10,752 H100 GPUs  
43 EF AI Compute  
1100 TB/s BW

### Next AI Factory

32,000 GPUs  
645 EF AI Compute  
58,000 TB/s BW

EF- ExaFLOPs  
BW- Bandwidth

# Hybrid Data Centers (Air + Liquid Cooling)



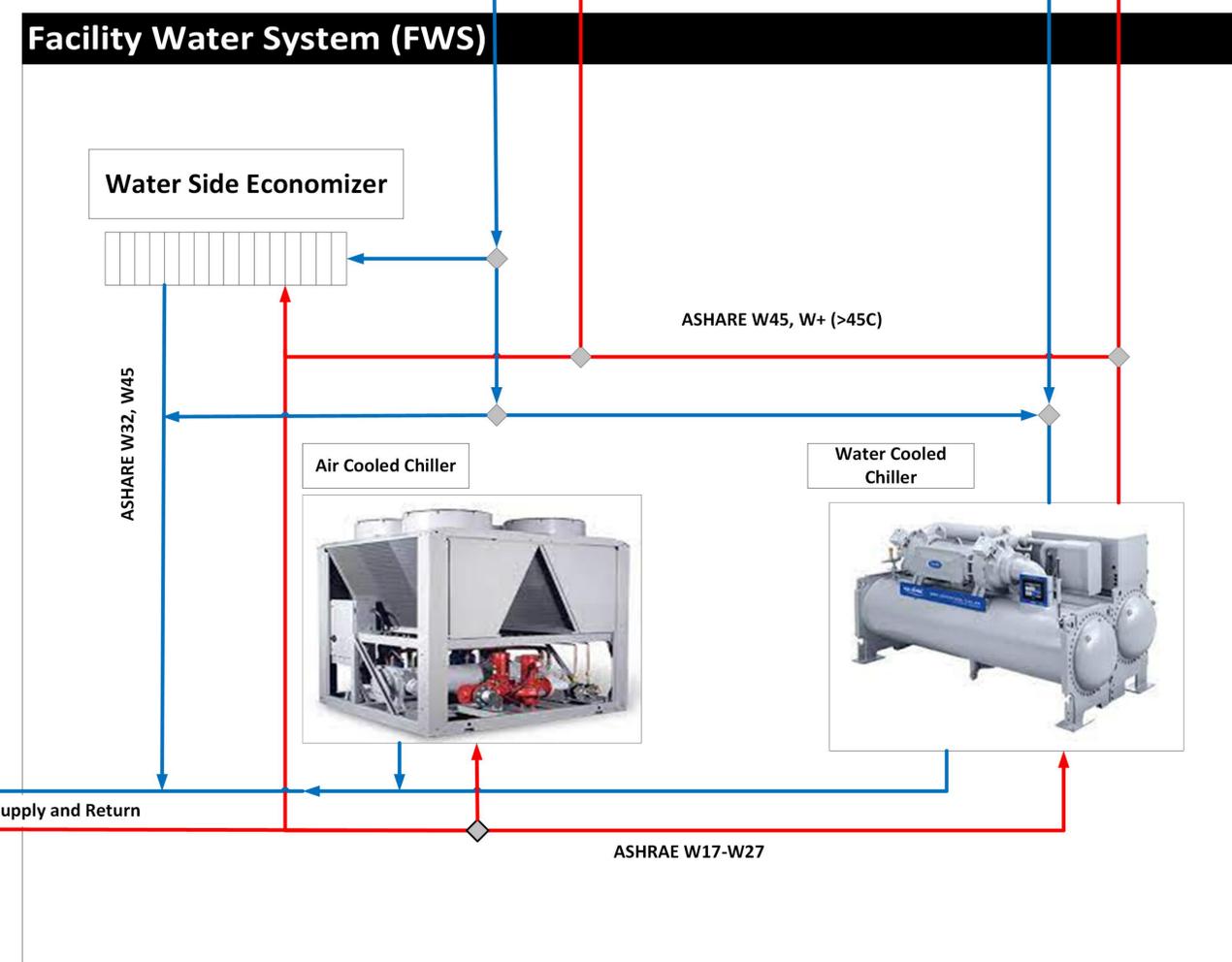
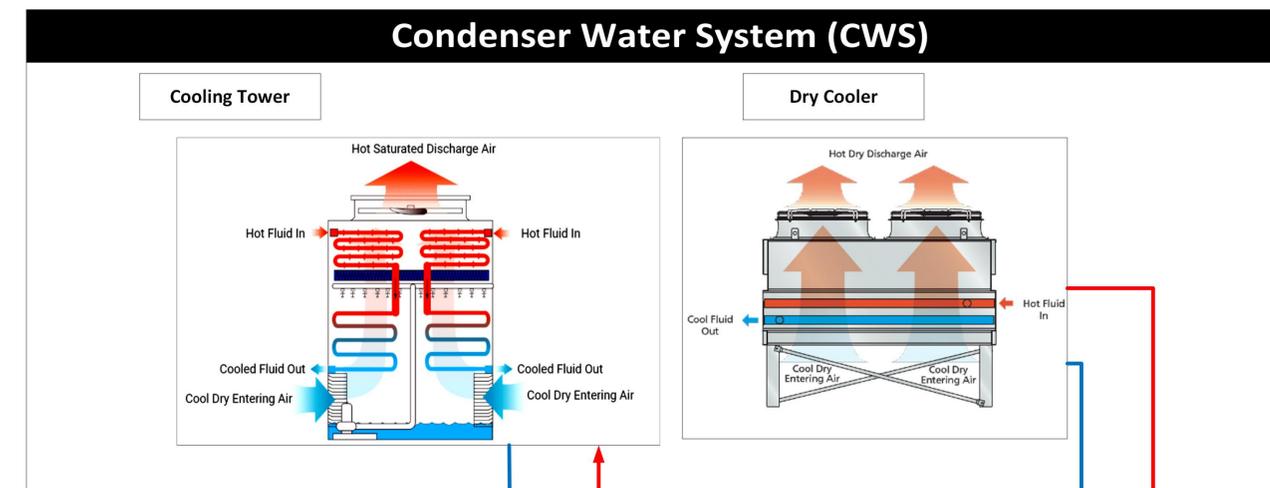
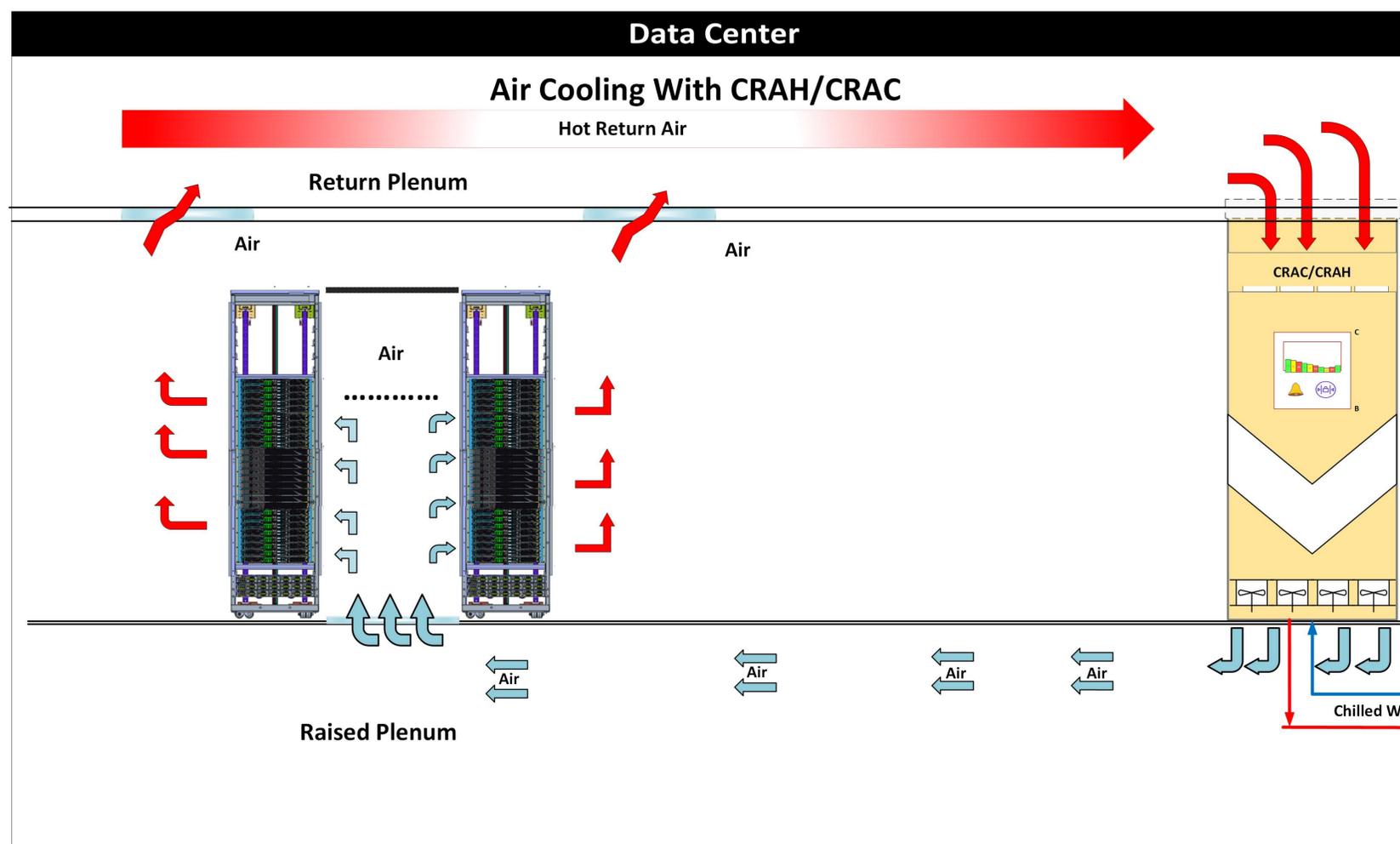
- Cold aisle containment with supply of air through perf tiles in the cold aisles, return of the air to the CRAHs in the hot aisle
- Liquid supply (PG25) to the rack manifolds using QDs to servers
- Flow distribution through the data center using row manifolds and headers from Cooling Distribution Units (CDUs) and Heat Exchanger Sidecars.

# Schematic of Data Center Cooling Technologies

## Air Cooling

### Air cooling with CRAH/CRAC

- Room-based cooling, suitable for low density racks
- Heat picked by air is transferred to facility chilled water in CRAH.
- Raised/ slab floor.
- Cold aisle or hot aisle containment.

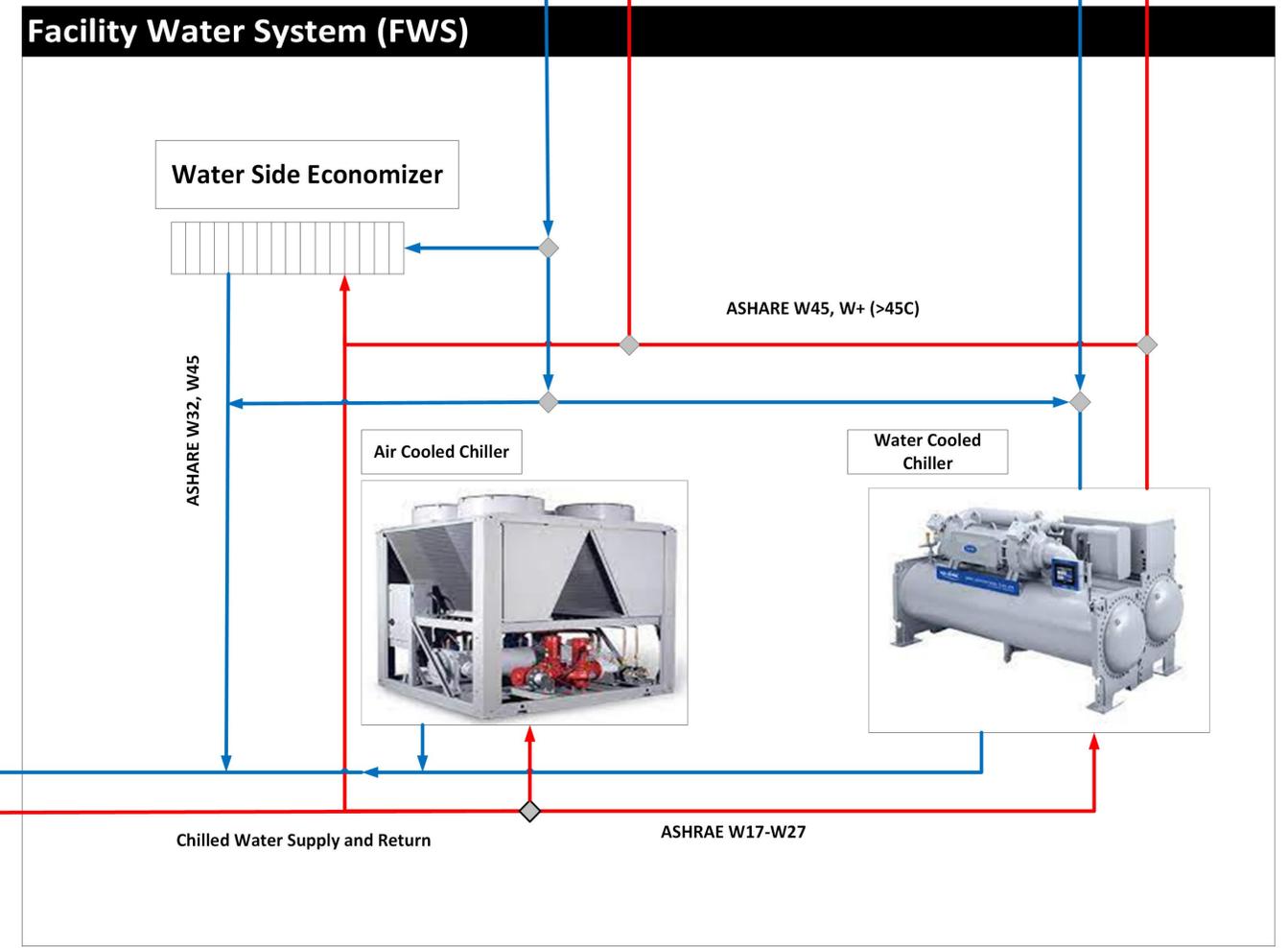
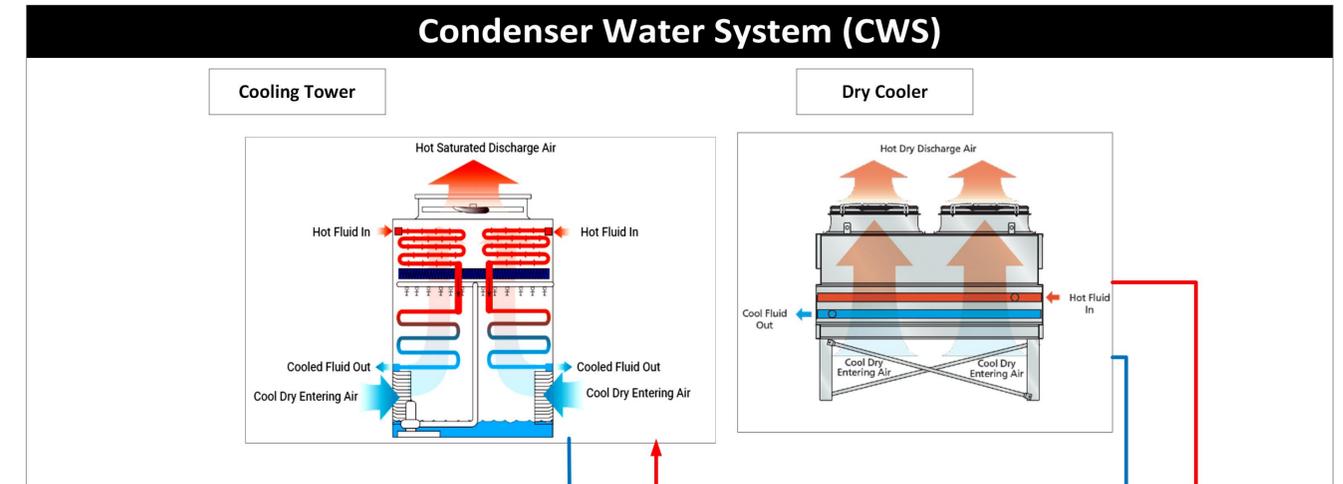
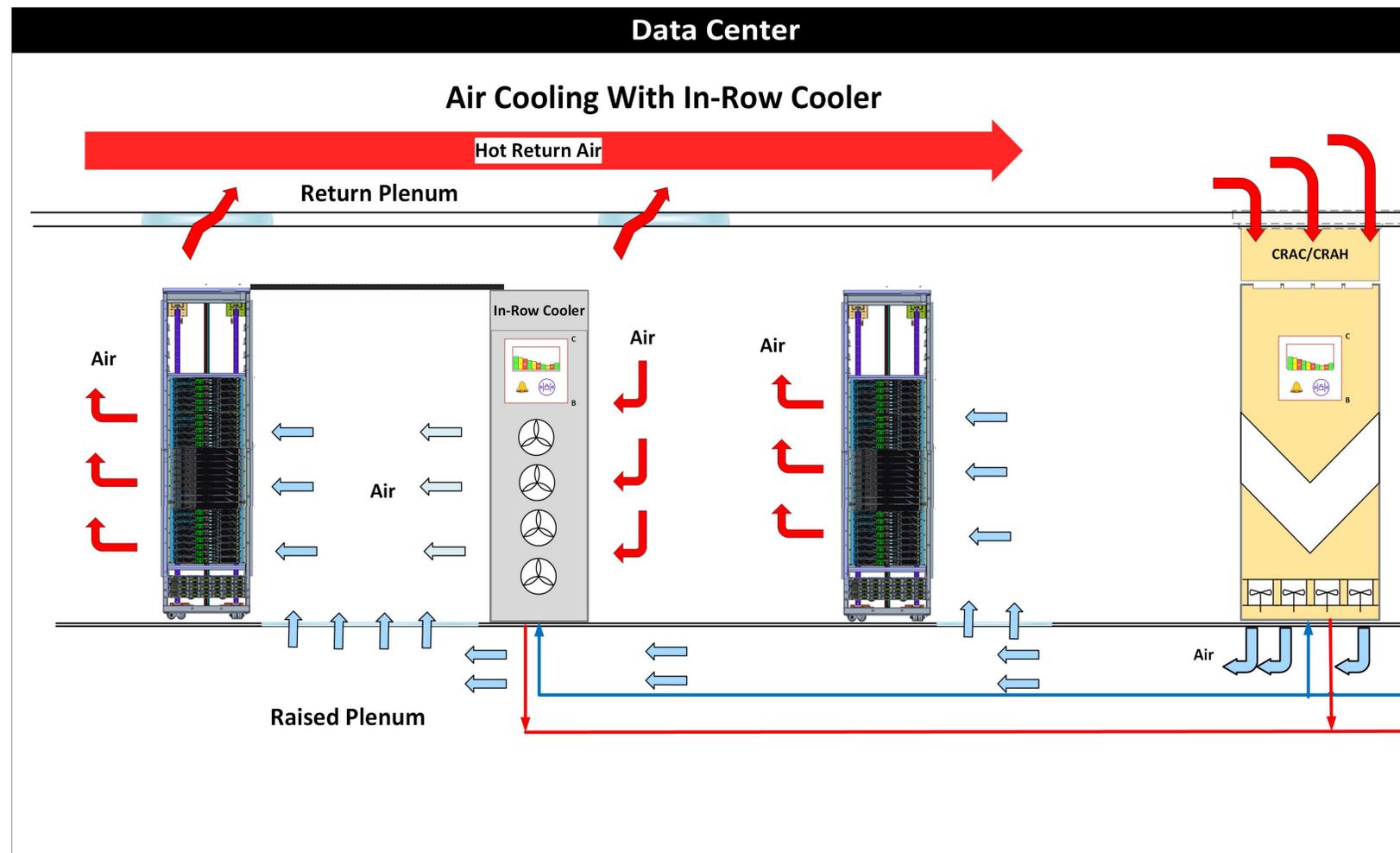


# Schematic of Data Center Cooling Technologies

## Air Cooling

### Air cooling with In-Row Coolers

- Aisle-based cooling, suitable for medium density racks
- Heat picked by air is transferred to facility chilled water through In-Row Coolers and CRAH unit.
- Raised/ slab floor.
- Cold aisle or hot aisle containment

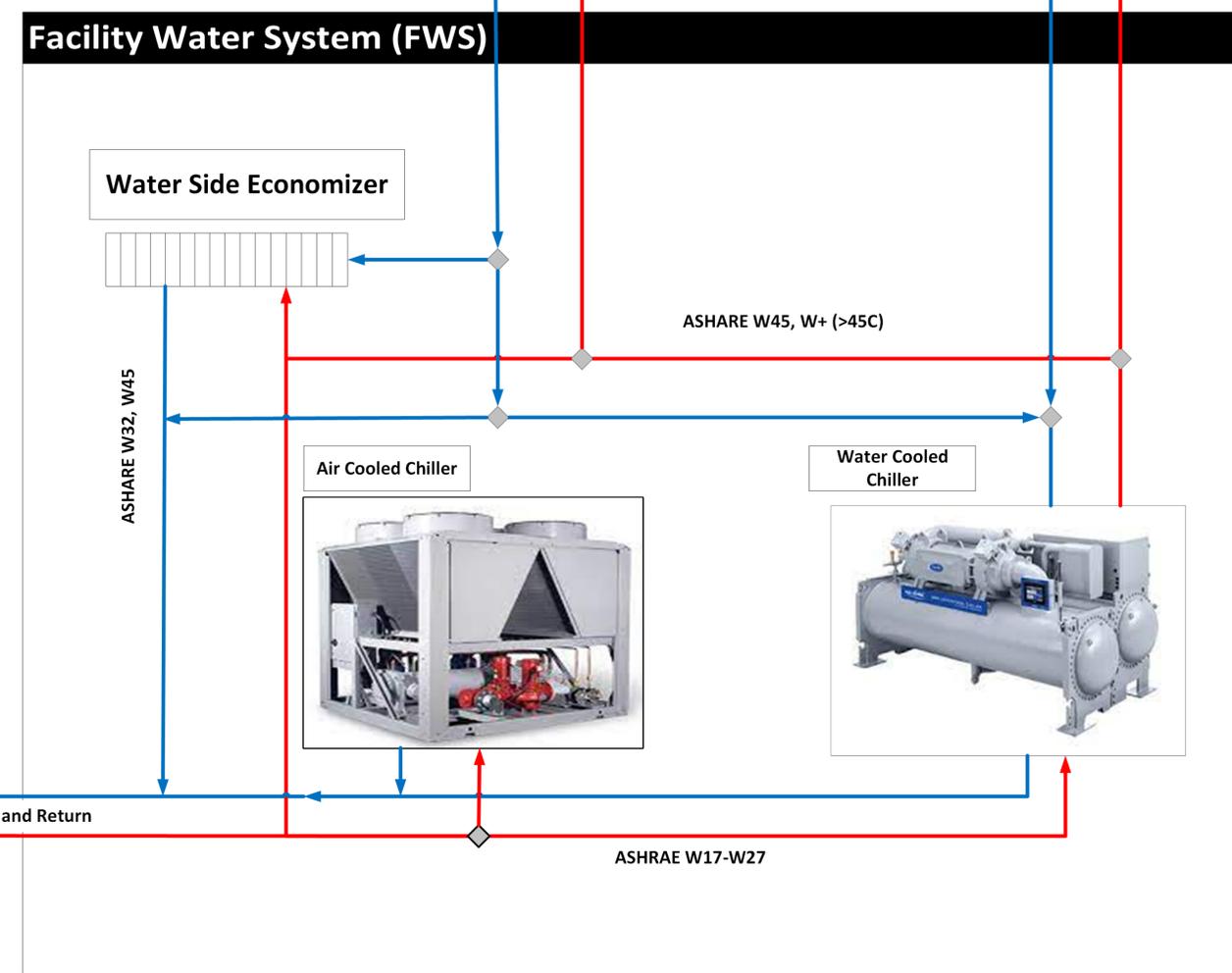
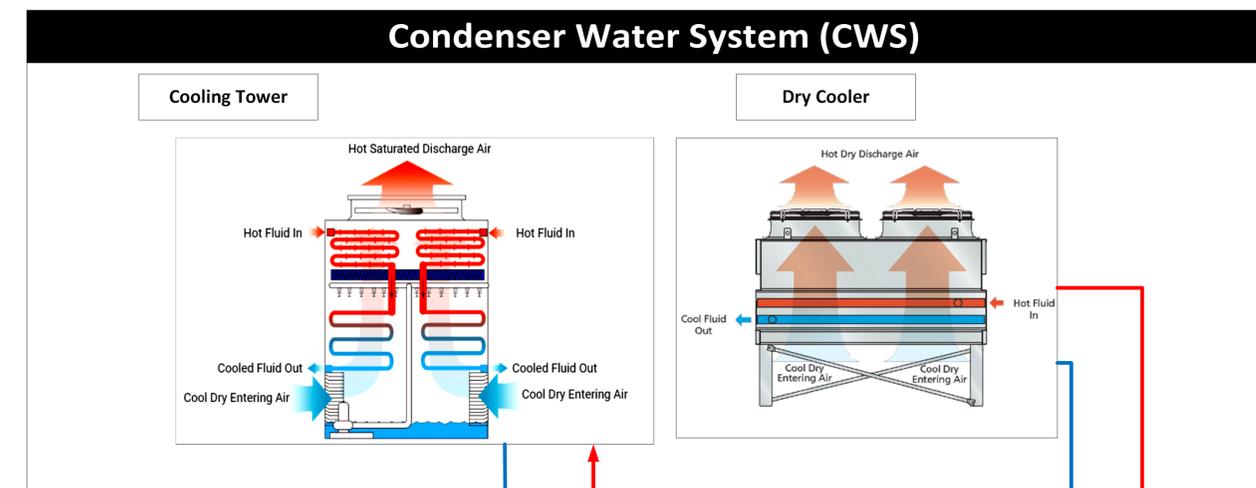
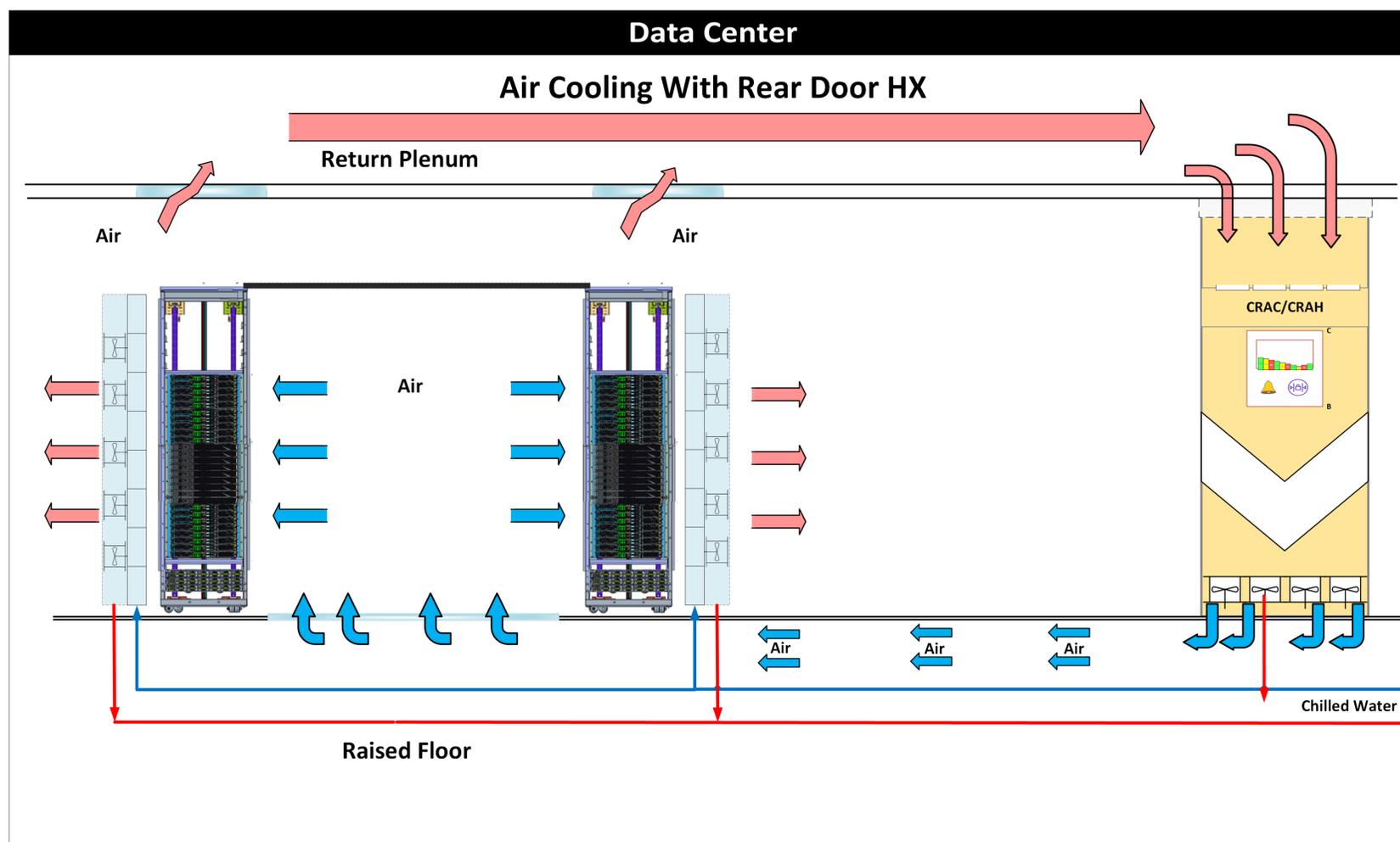


# Schematic of Data Center Cooling Technologies

## Air Cooling

### Air cooling with Rear Doors Heat Exchangers (RDHX)

- Rack-based localized cooling; suitable for medium density racks.
- Heat picked by air and transferred to facility chilled water via RDHX.
- Raised/ slab floor.
- Could be used as standalone or as assisted cooling in conjunction with CRAH units.



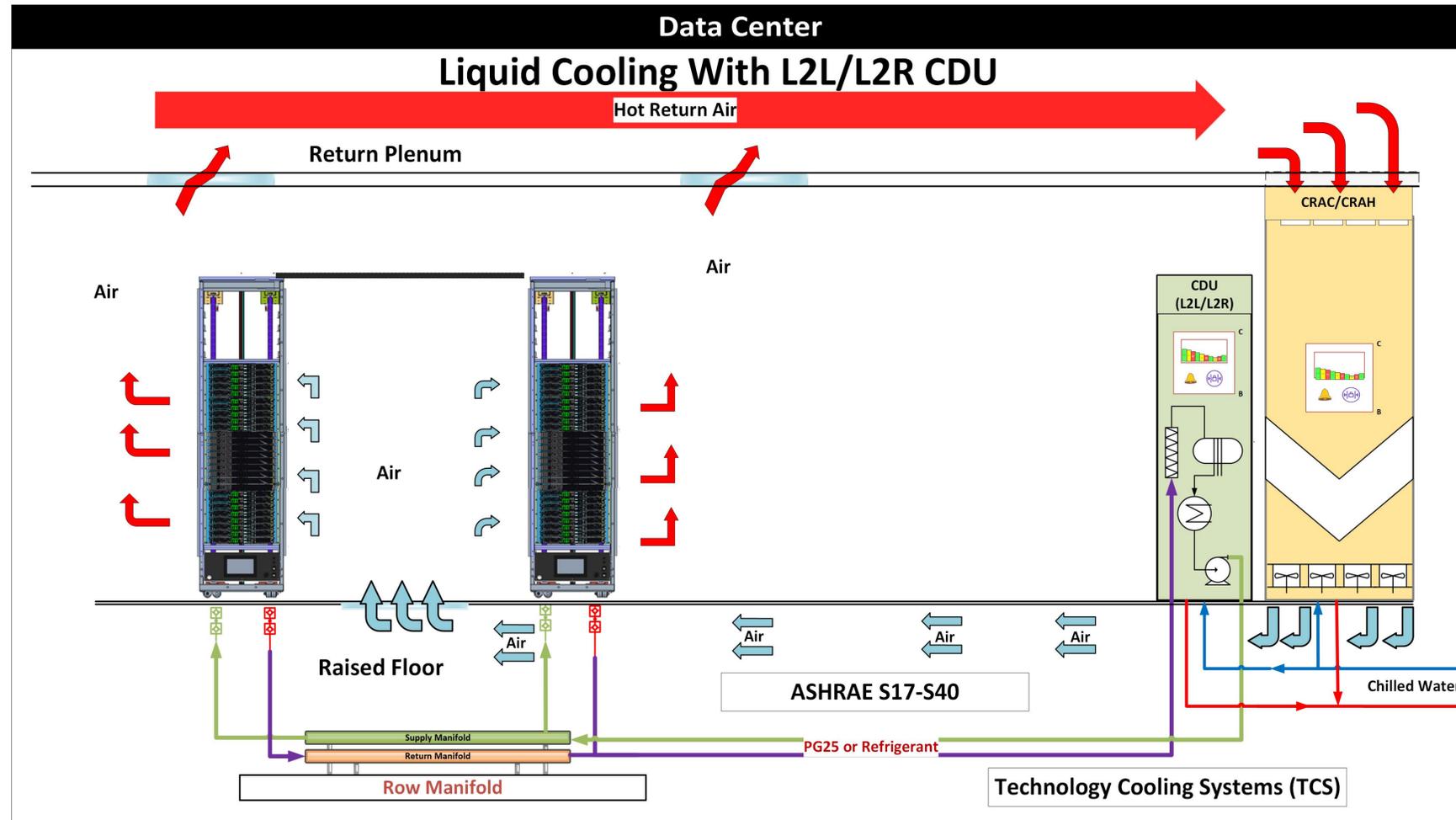
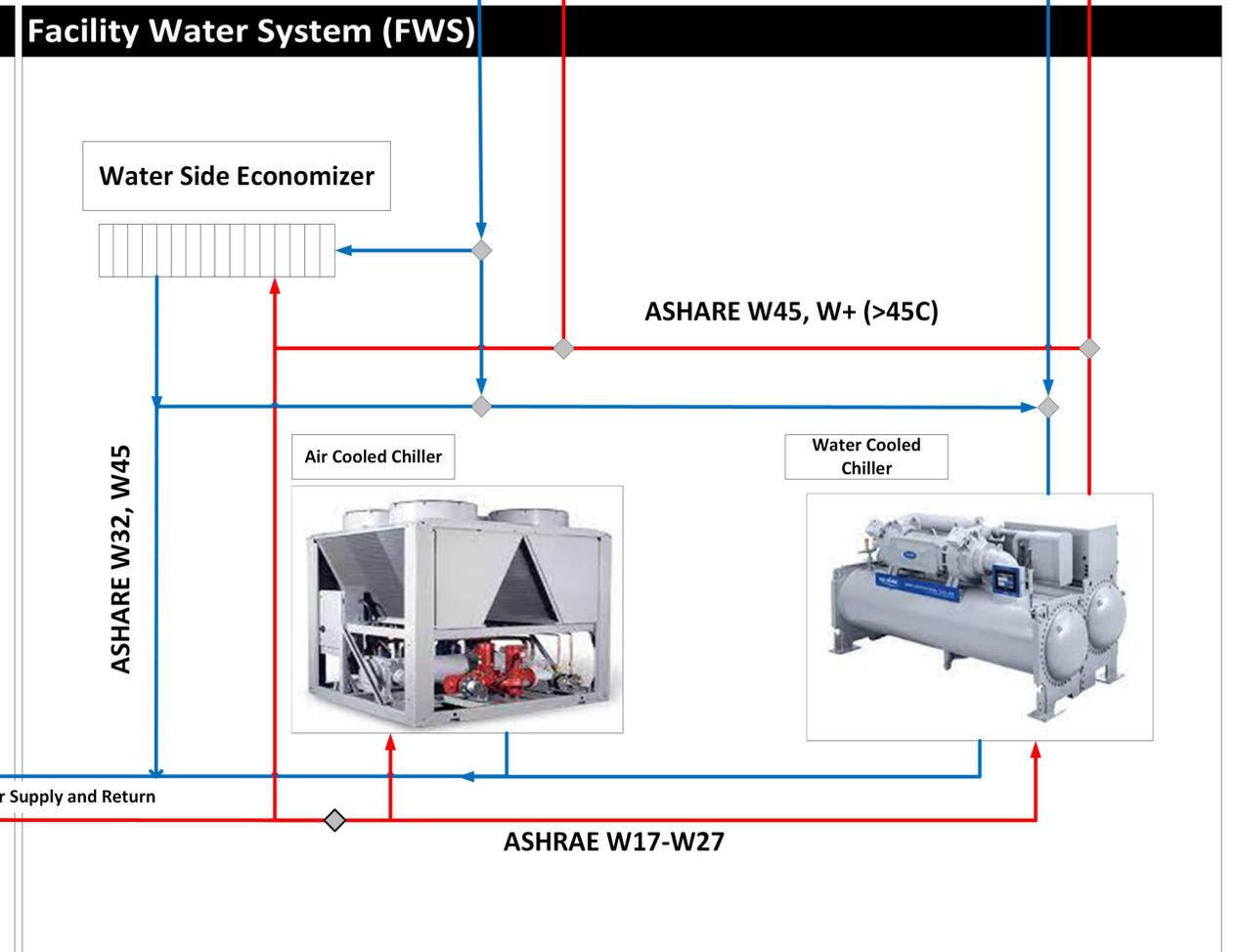
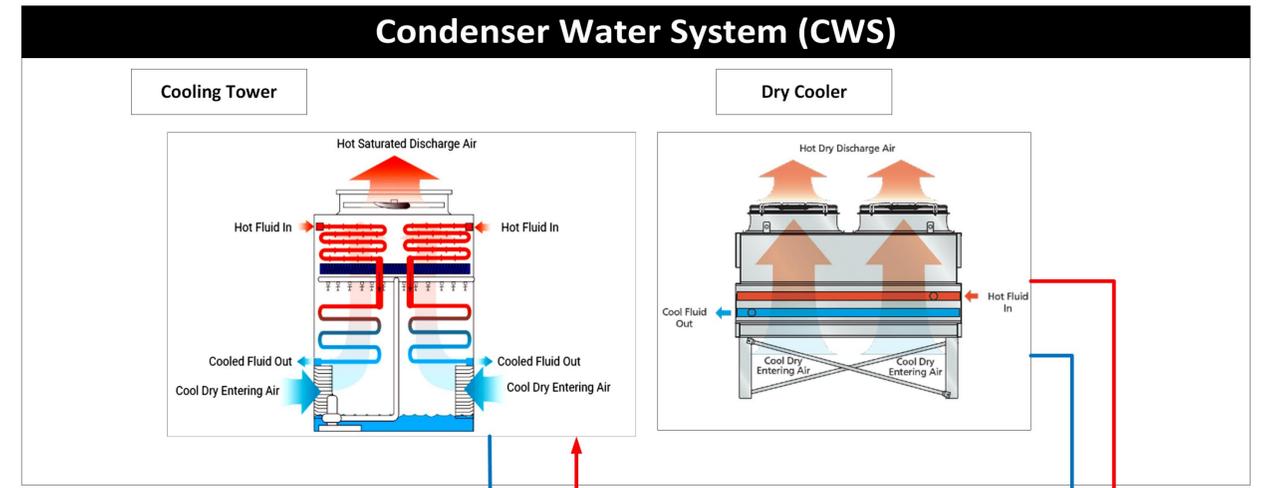


# Schematic of Data Center Cooling Technologies

## Air and Liquid Cooling

### Liquid cooling with Liquid-to-Liquid CDU (L2L)

- Aisle-based hybrid of air/liquid cooling, suitable for high density racks
- Row-based cooling distribution units can remove MWs of IT heat in a 4'x4'x6' CDU unit.
- Additional liquid cooling Infrastructure required.
- Transitional solution – Limit of single-phase liquid cooling.



# Liquid-to-Air Cooling Solution

## The need for L2A CDUs

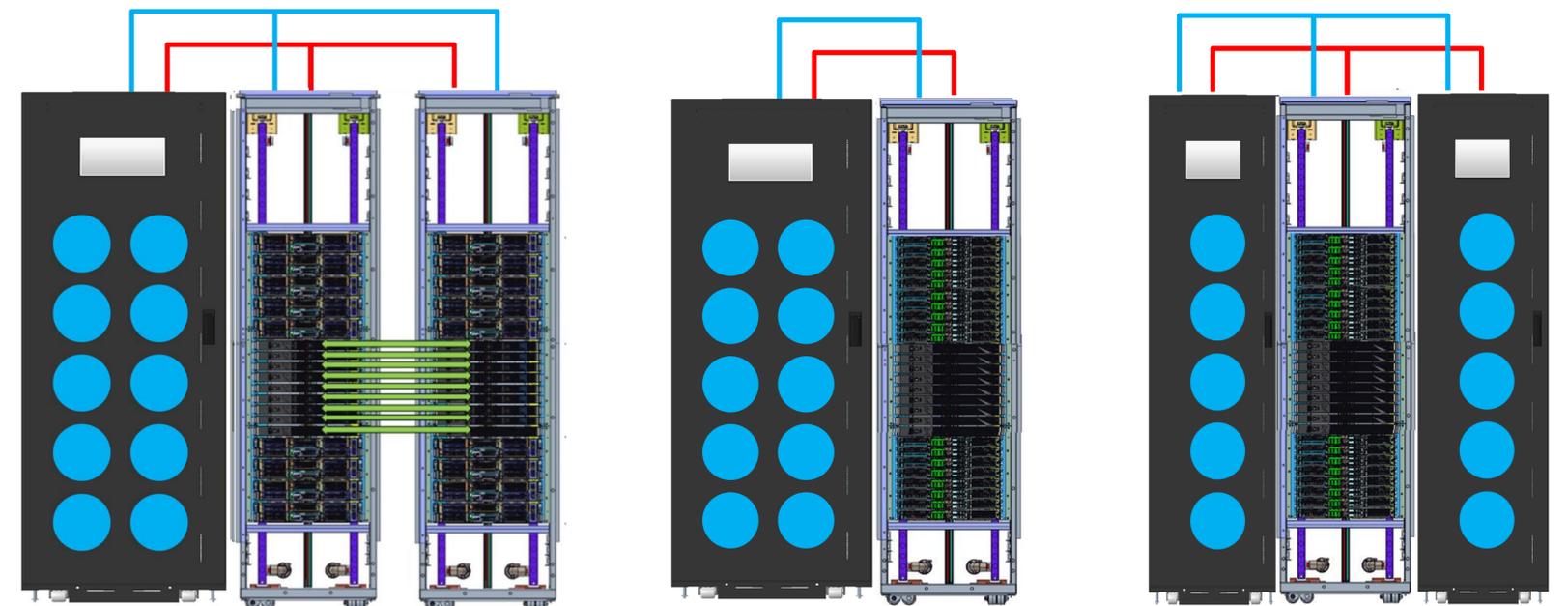
- Intermediate solution for legacy air-cooled data centers that utilizes existing infrastructure to deploy liquid cooled IT.
- Liquid-to-Air cooling distribution units provide ~60kW cooling in a 2'x4'x6.5' space has similar characteristics as IRCs.
- Power consumption of ~4% nominal cooling capacity.

## L2A CDUs Evaluation Criteria

- Emulators design/build to simulate LC servers.
- Buildup of test lab-controlled environment
- Performance evaluation of L2A CDUs against product requirement.
- Digital Twin buildup of L2A CDUs with CFD/FNM

## CDU-Rack Configurations

- Single rack-width vs double rack-width L2A CDUs
- Cooling capacity (kW) vs pumping capacity (LPM/kW) constraints. CFM/kW constraints, typical cooling capacity of ~60-120 kW per rack footprint.
- Data center air flow distribution balancing and CRAH return air temperature limitations.



# Direct to Chip Liquid-to-Liquid CDU Solutions

## L2L Cooling System Configuration

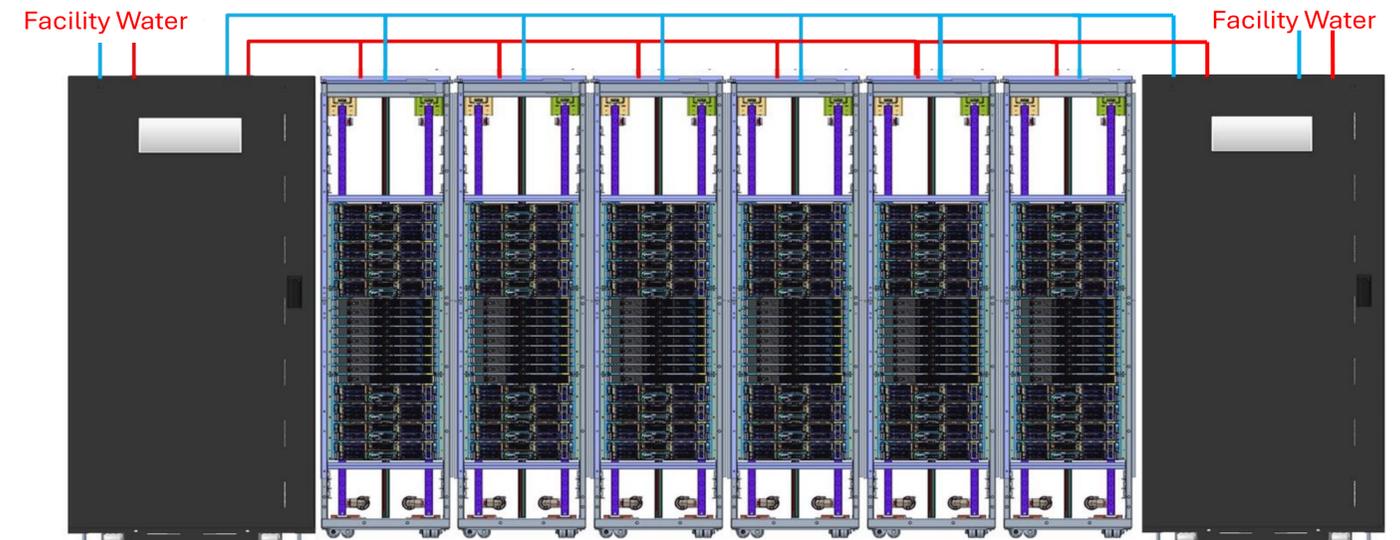
- Liquid-to-liquid cooling distribution units provide ~2MW cooling in a 4'x4'x6.5', in 2.75x less space produces 6.5x more cooling than CRAHs
- Power consumption of ~1% nominal cooling capacity

## L2L CDUs Evaluation Criteria

- Emulators designed/built to simulate LC servers.
- Buildup of test lab-controlled setup.
- Performance evaluation of L2L CDUs.
- Physics aware Digital Twin model of L2L CDUs.

## CDU-Rack Configuration

- L2L CDUs availability: Rackmount (60 KW – 200 KW), mid-range In-row (400 KW - 800 kW), high-range In-Row (1000 KW - 2400 kW) CDUs
- Rack-based fluids flow distribution controls, capability to establish pressure differential controls for each liquid cooled rack.



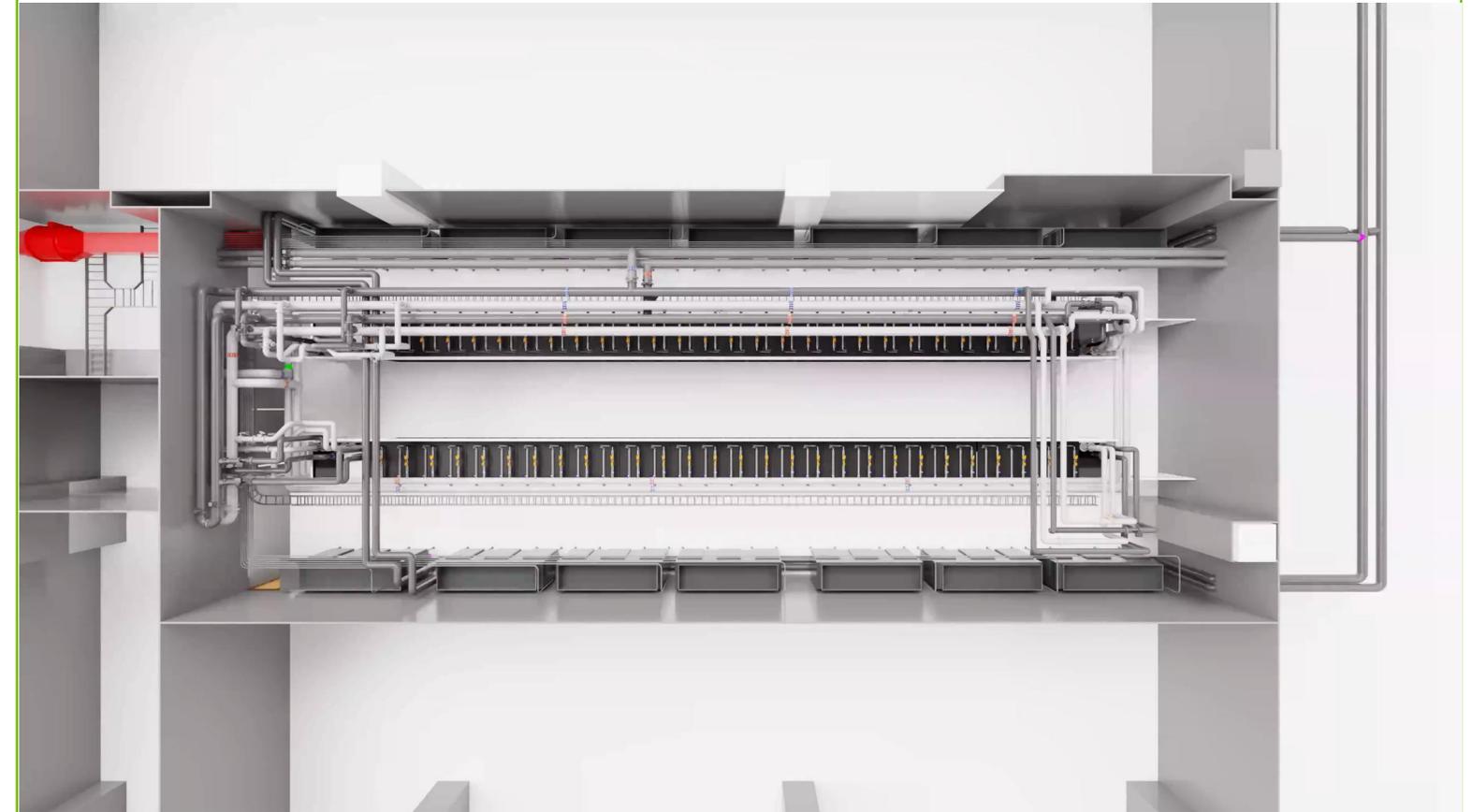
# Omniverse Digital Twin of Liquid-Cooled Data Center

## Liquid-to-Air and Liquid-to-Liquid Cooled Data Center

L2A Cooled Data Center



L2L Cooled Data Center

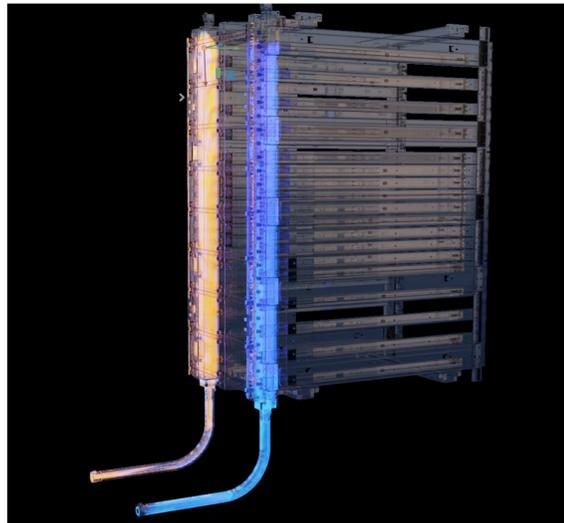


# Liquid-Cooled Data Center Modeling

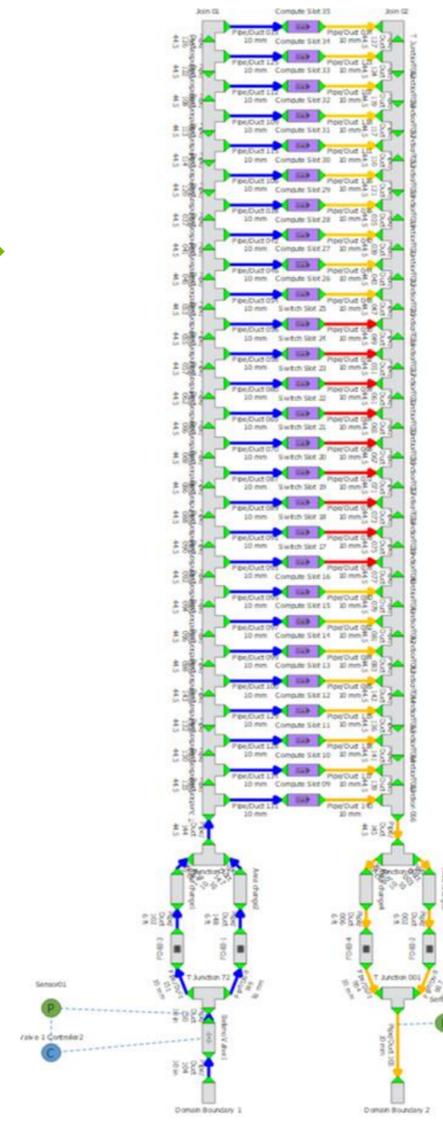
CFD (Computational Fluid Dynamics) & FNM (Flow Network Modeling)

## Rack Level Cooling

Flow Network Model for Rack Level Liquid cooling

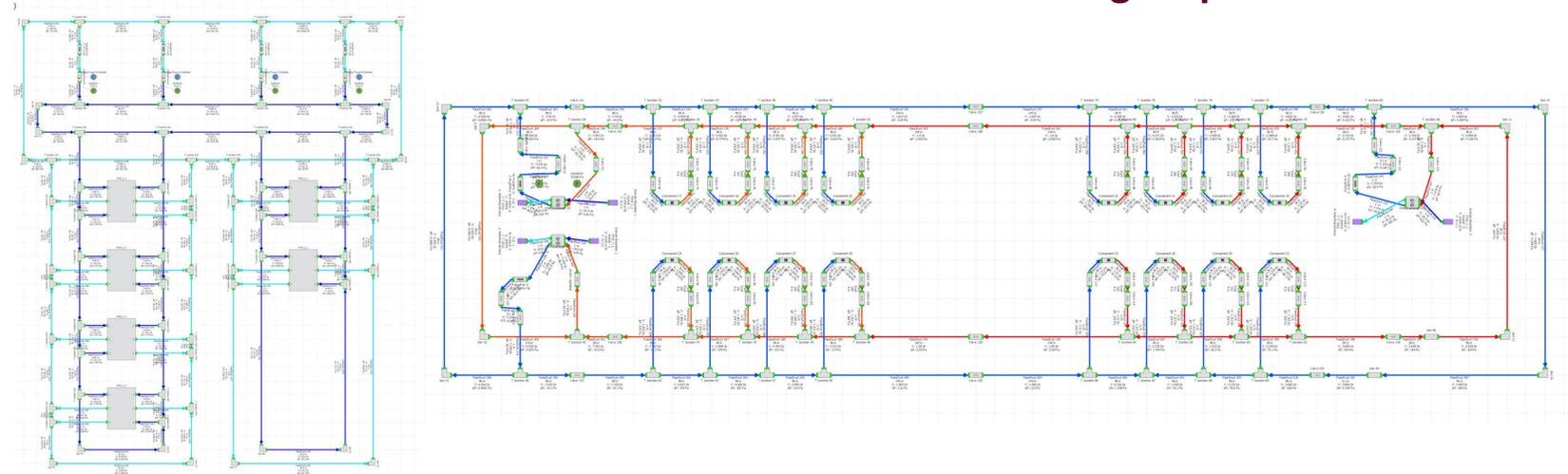


CFD for Rack Level Air Cooling



## DC Level Cooling

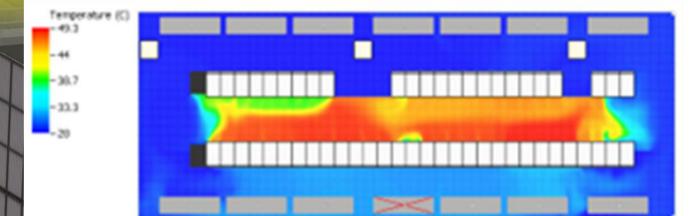
Flow Network Model for Data Center Cooling loop



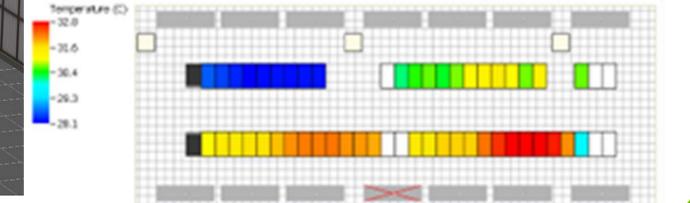
Simulation for Liquid and Air Cooling in Data center

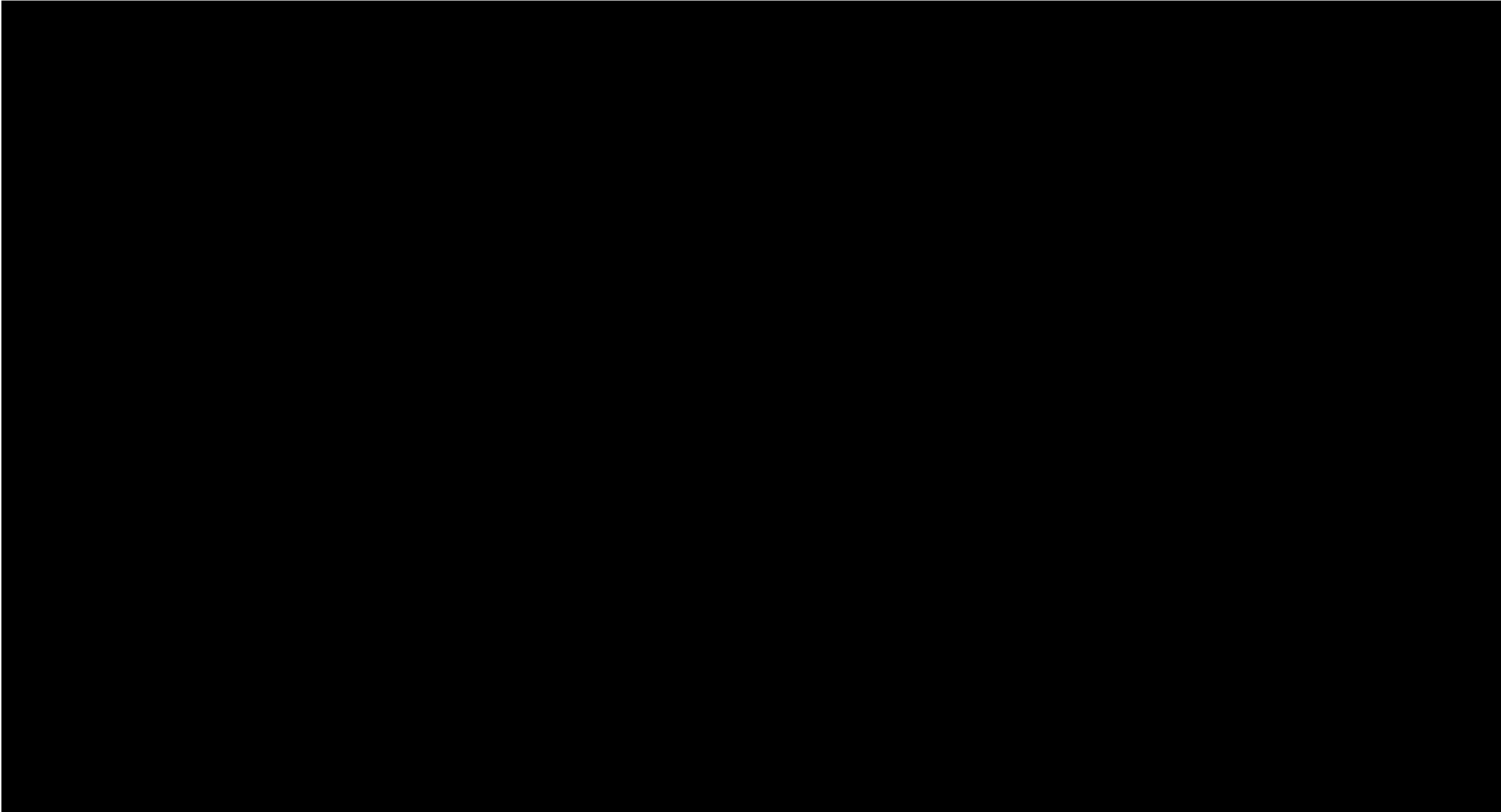


Temperature Profile at halfway cabinet height



Maximum rack inlet temperature





# AI-Accelerated Data Center Digital Twin

Generative AI for Data Center Design

Reinforcement Learning for Data Center Optimization

Physics-Informed AI Simulator  
1200X CFD Speedup

Virtual Testing Environment  
L2L/L2A CDUs

## Dynamic Digital Twin



Industrial Metaverse  
Nvidia Omniverse + Nvidia Modulus



## Physical Twin



Data Center aka "AI Factories"

In Omniverse  
- Designed  
- Optimized  
- Controlled

Energy Usage Prediction and Carbon Footprint Reduction

Predictive Failure Maintenance aiding Cost Savings

BCs to PINNs for Physics Simulation  
IoT/Infrared Images

# Data Center Digital Twin: AI-Driven DC Design & Operations

## Features

### Real Time Simulation

**Inferencing** and simulating the physics in real time

### Design DT

**Predicting** product needs before manufacturing

### Operation DT

Accruing **sensor data** and monitoring  
Testing **failure scenarios**

### Control DT

**Tuning** the control system dynamically  
Response to system architecture change

## Requirements

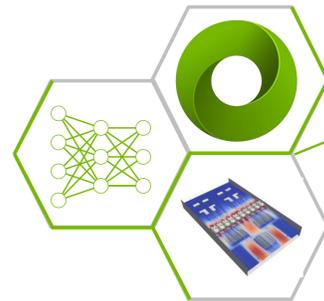
### Components

- CDU
- Servers
- Racks
- DC facility



### Tools

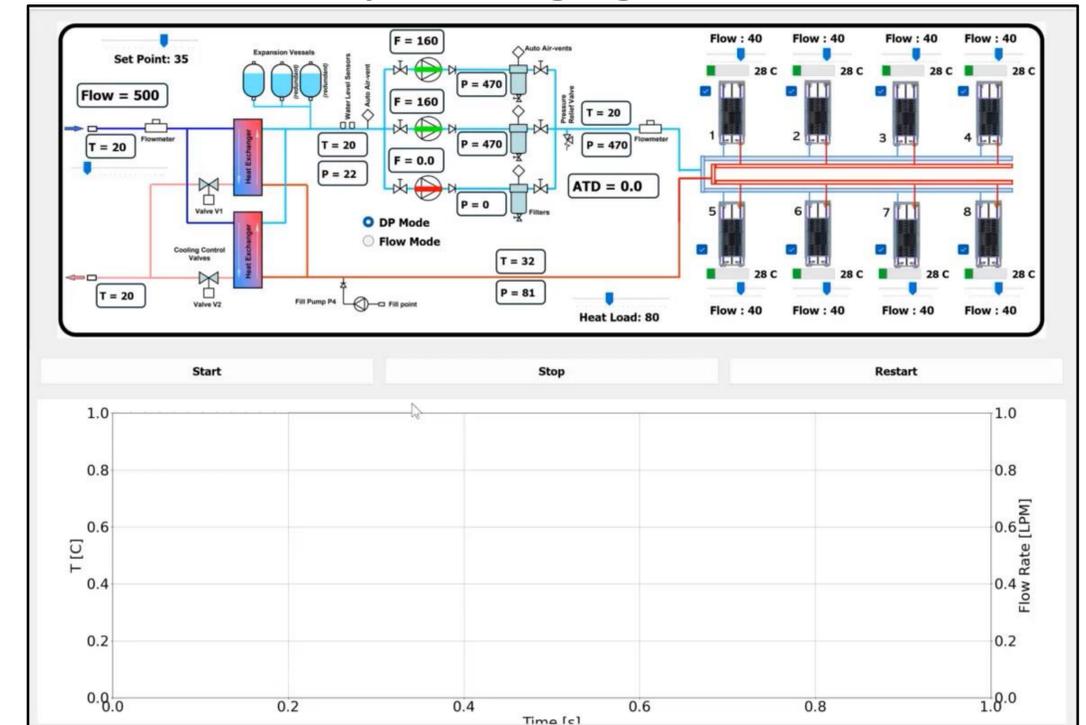
- Omniverse
- Modulus's PINN
- CFD
- FNM



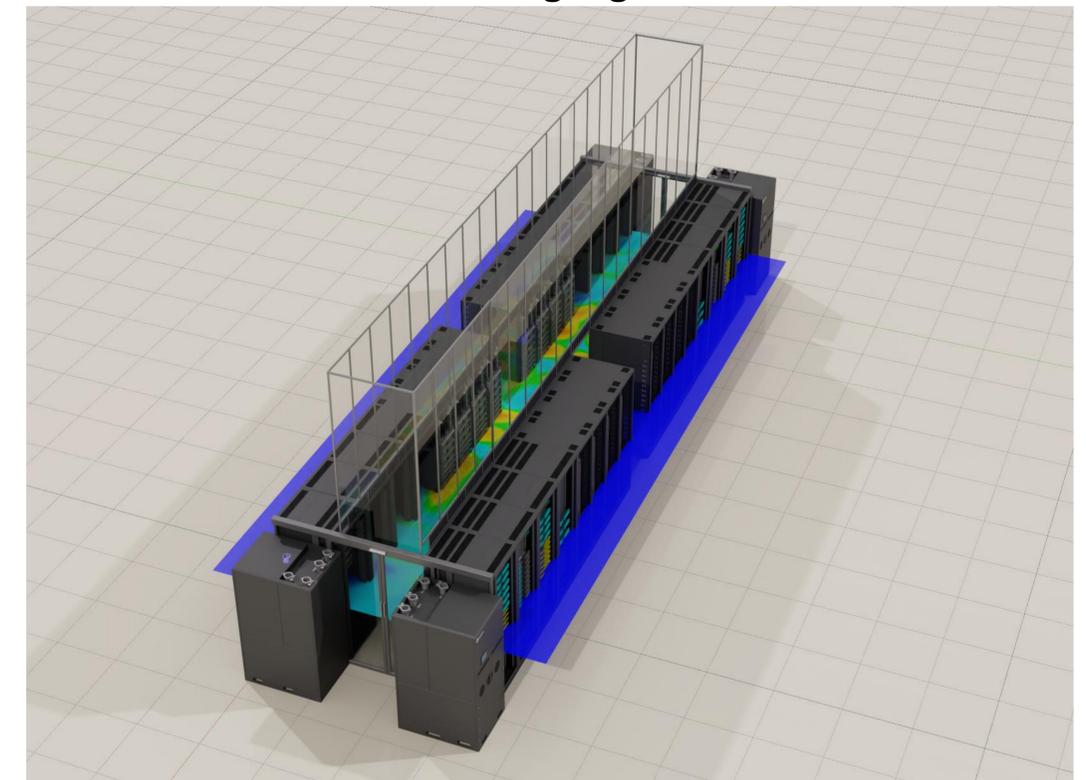
### DC requirements

- Physical spec
- IT spec
- POD design & spec

## Liquid Cooling Digital Twin



## Air Cooling Digital Twin

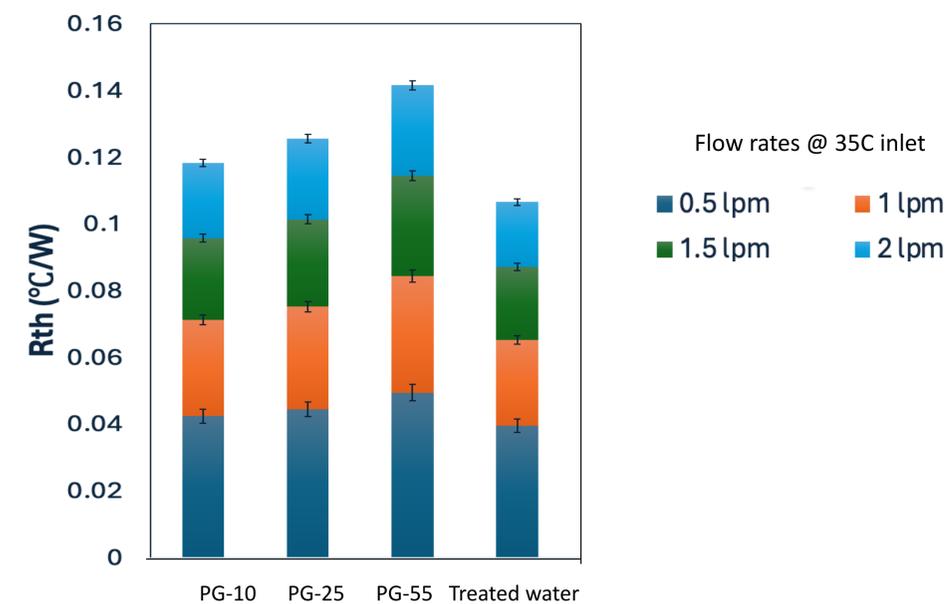
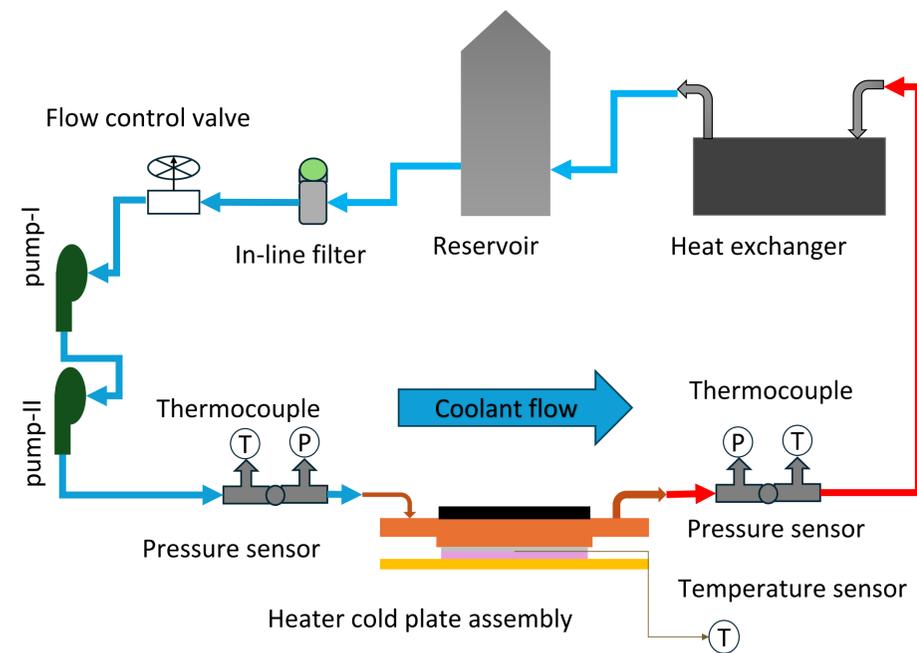


Real-time inference of thermo-fluid dynamics in a POD using NVIDIA Modulus and Omniverse.

# Research Focus: Secondary Fluids, Corrosion, Erosion Studies

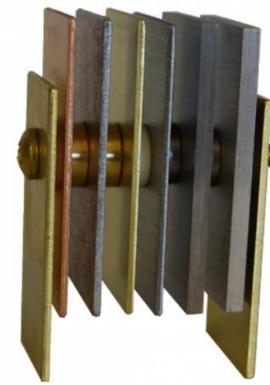
## Performance

- Evaluating multiple coolants for thermal performance using thermal test vehicles.

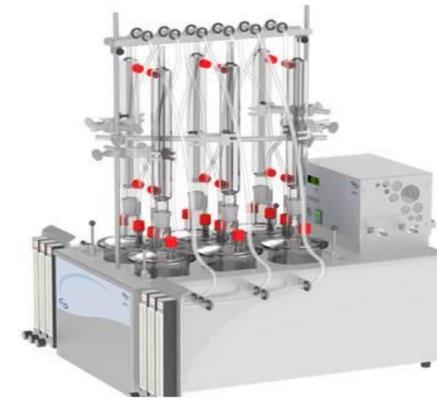


## Corrosion

- Using ASTM-D1384 and D8040 based testing to evaluate corrosion of wetted materials.



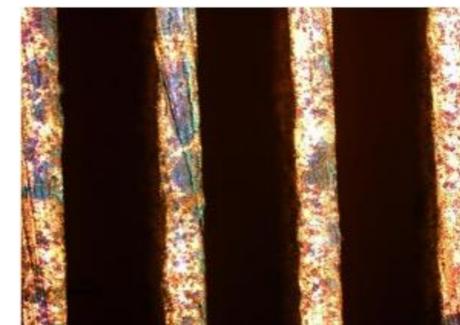
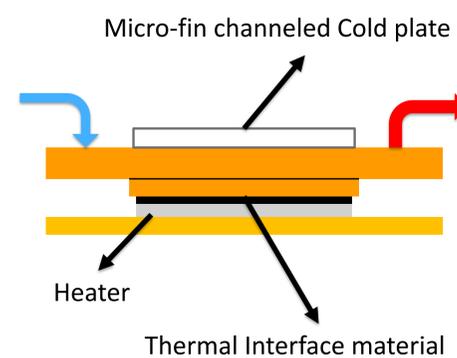
Coupon Set



Thermal Bath

## Erosion

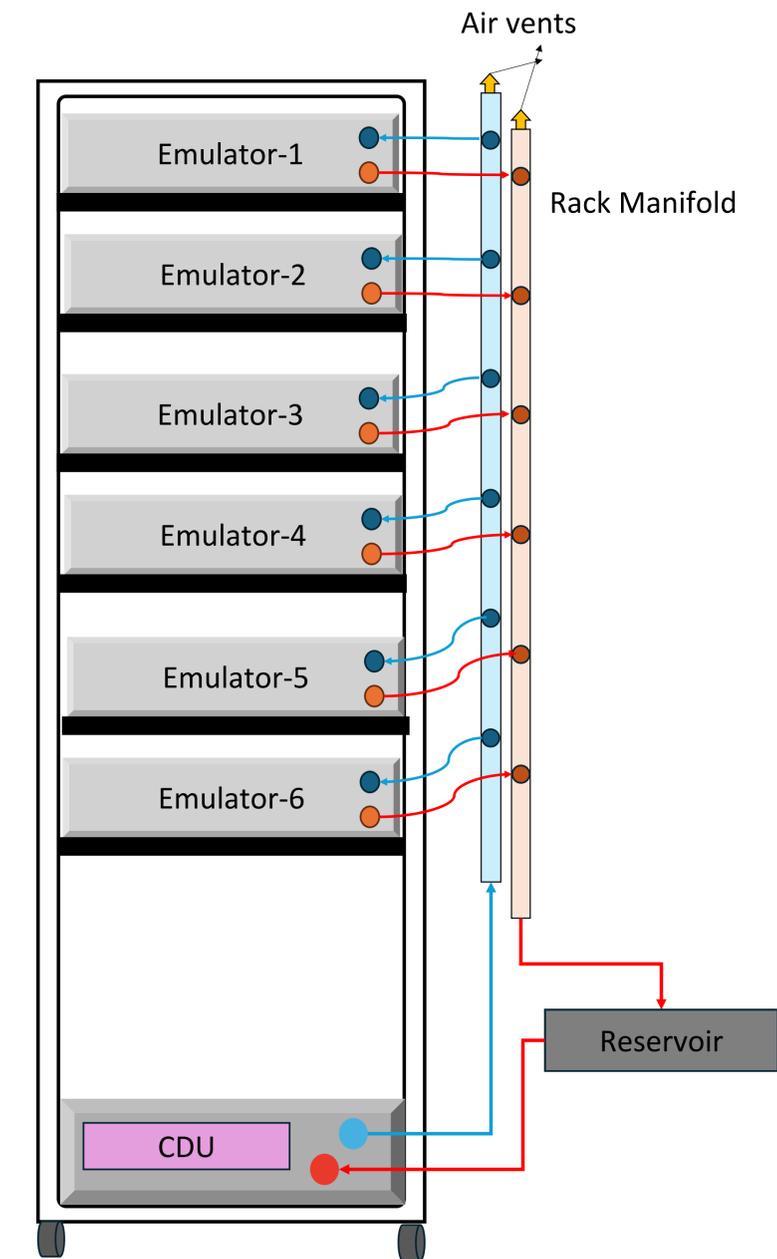
- Applicability of ASHRAE erosion fluid velocity limit of 1.5 m/s for liquid cooling applications



Micro-fin channels

## Bio-growth

- Analyzing bio-growth in coolants for both stagnated and continuous circulation scenarios.



Rack Emulator

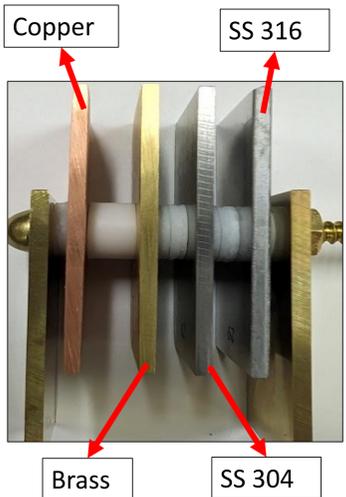
# Coolant Reliability

## Corrosion

- ASTM-D1384 and D8040 based testing to evaluate corrosion Inhibitor efficiency of Glycol based and water-based with respect to data center wetted materials.



ASTM test setup



Coupon set



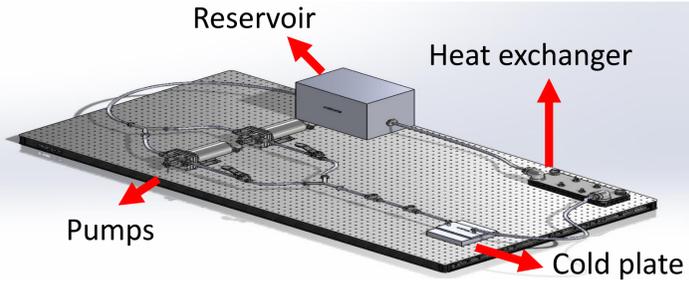
Test coupons before testing



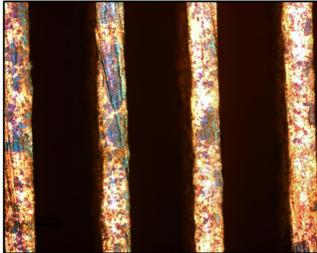
Test coupons after testing

## Erosion

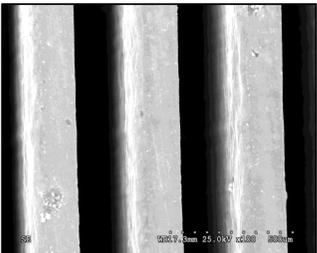
- Applicability of ASHRAE erosion fluid velocity limit of 1.5 m/s for liquid cooling applications in a TCS loop



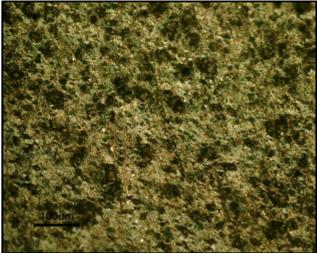
CAD model of Test Setup



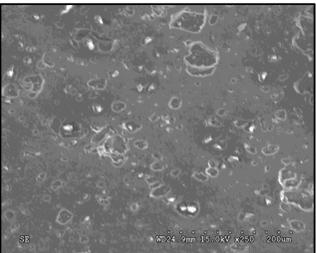
Optical image of micro fin channel



Micro-Fin Channel Surface on a SEM



Optical image of EPDM hose



EPDM Hose Surface on a SEM

### Future tests

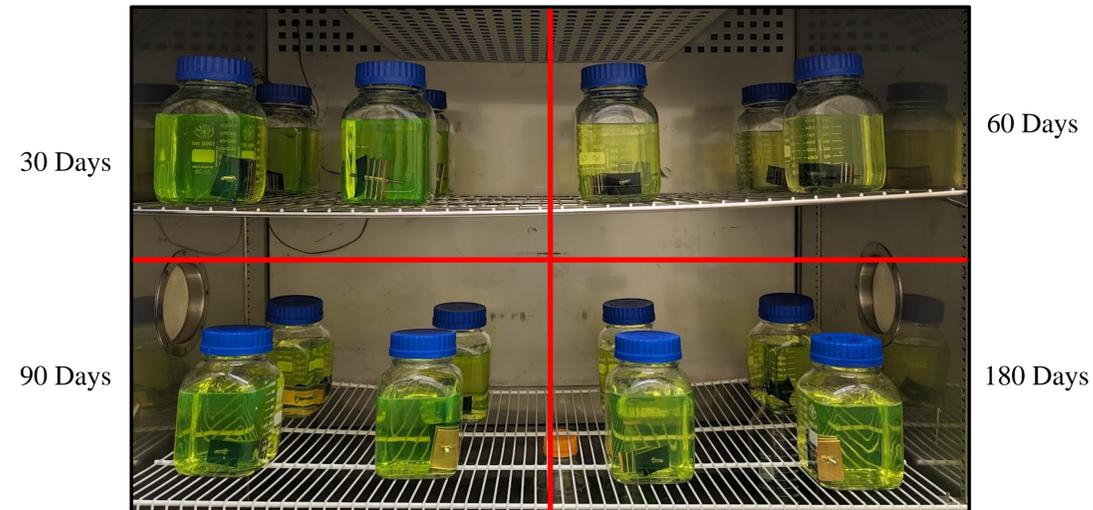
- EPDM erosion test at 6.5m/s
- Copper erosion - Shearing
- Copper erosion - Impingement

# Bio-Growth Analysis of Secondary Fluids

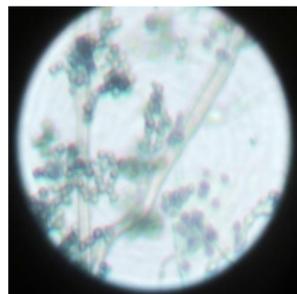
## Stagnated

- Analysis of bio growth in stagnated scenarios of cross-mixed glycols and water-based coolants
- Anerobic Bacteria growth potentials require continuous fluids flow

1. PG 1.8vol % -> 925ml of Treated water (A) + 75 ml of PG-25 (B)
2. PG 2.2vol % -> 990ml of Treated water (A) + 90 ml of PG-25 (B)
3. PG 2.5vol % -> 900ml of Treated water (A) + 100 ml of PG-25 (B)
4. PG 3.1vol% -> 875ml of Treated water (A) + 125 ml of PG-25 (B)



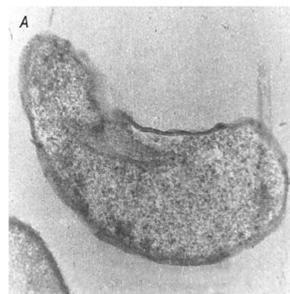
Air-tight glass jars Kept in Environmental Chamber



Fungal bacteria[#]



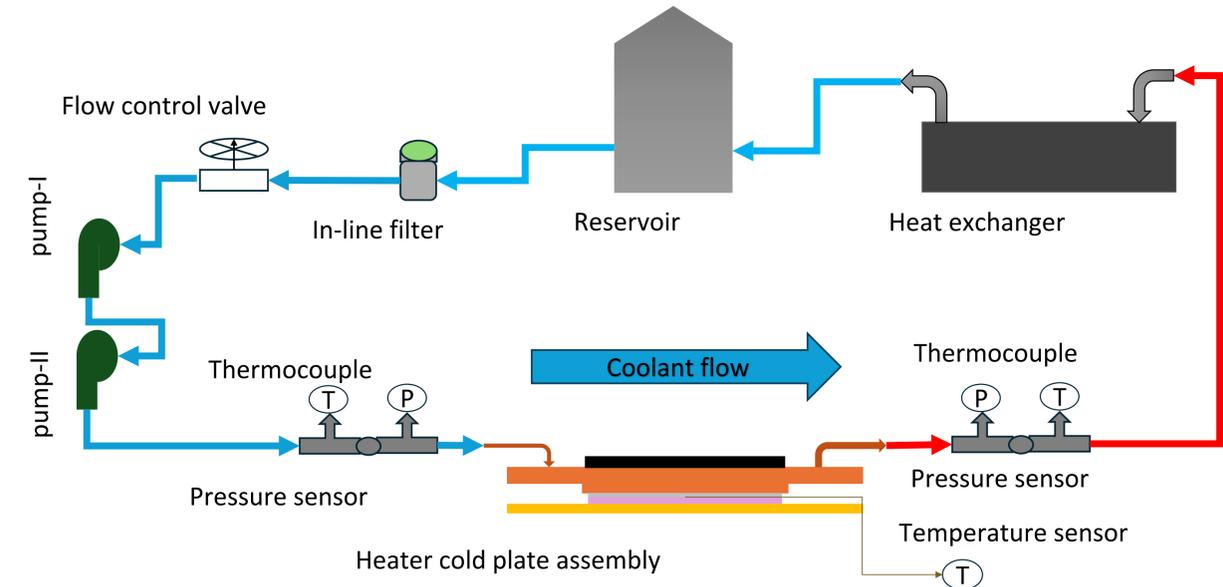
Aerobic bacteria[#]



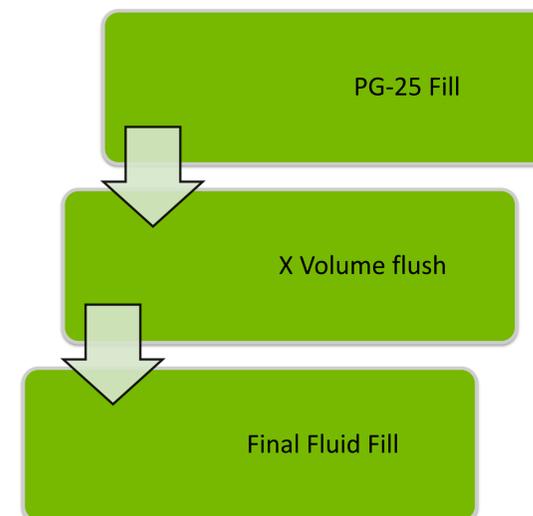
Anaerobic Bacteria(SRB)[#]

## Continuous Circulation

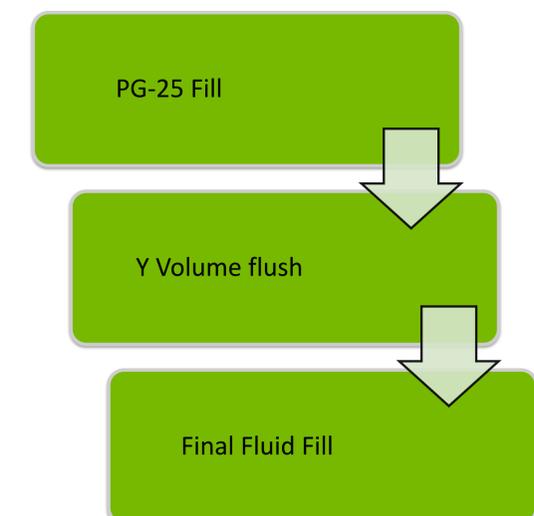
- Evaluation of bio growth in continuous flow scenarios following various flushing conditions
- Aerobic bacteria detection requires prescribed flushing followed by liquid cooling commissioning.
- Inline fluids monitoring and predictive maintenance for data centers.



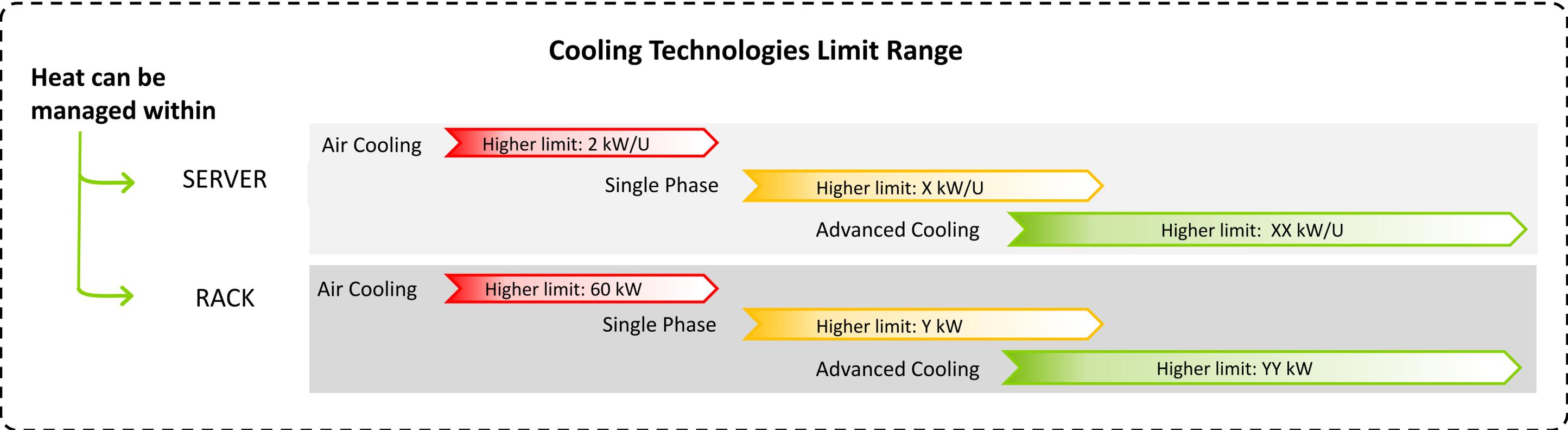
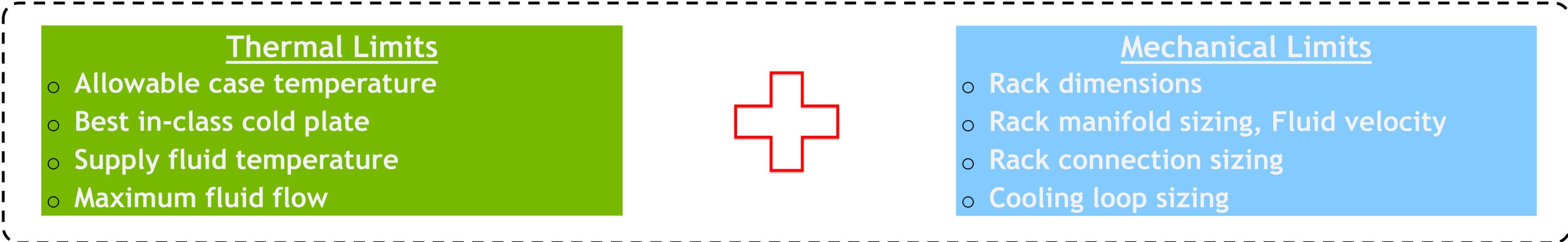
Test-I



Test-II

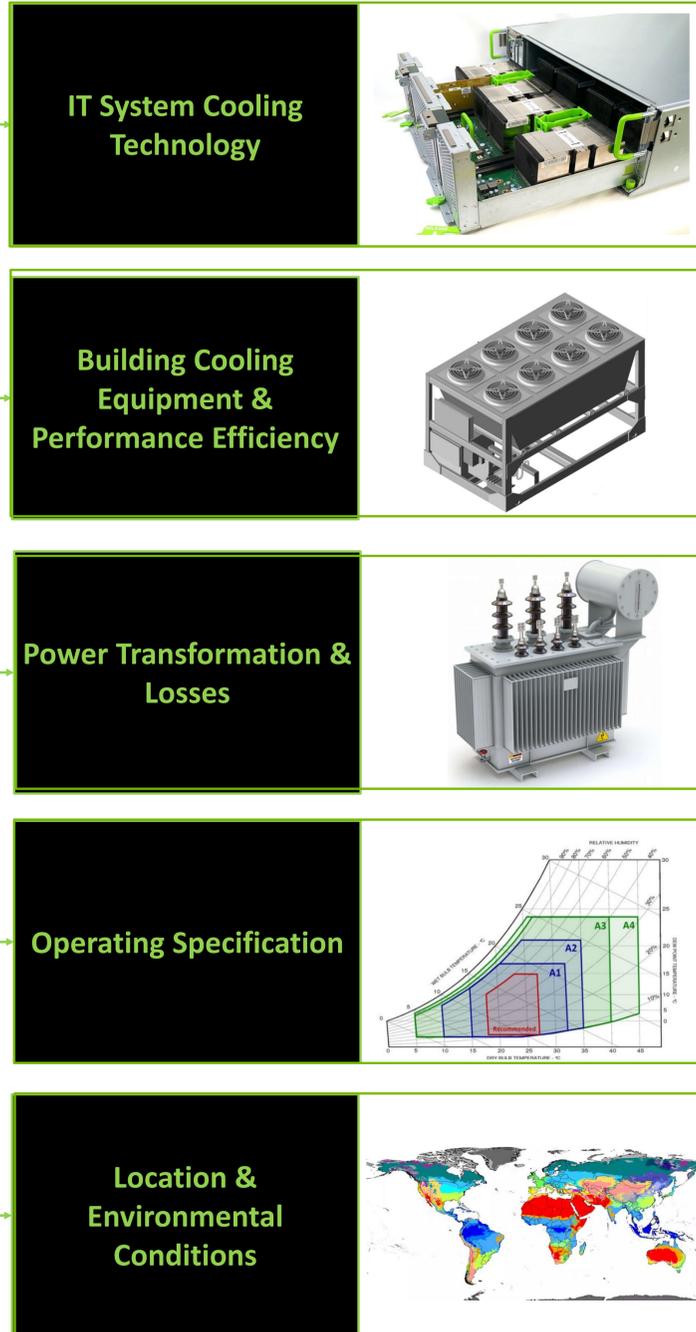


# Research Focus: Rack Power Density vs DLC Cooling Technology Roadmap

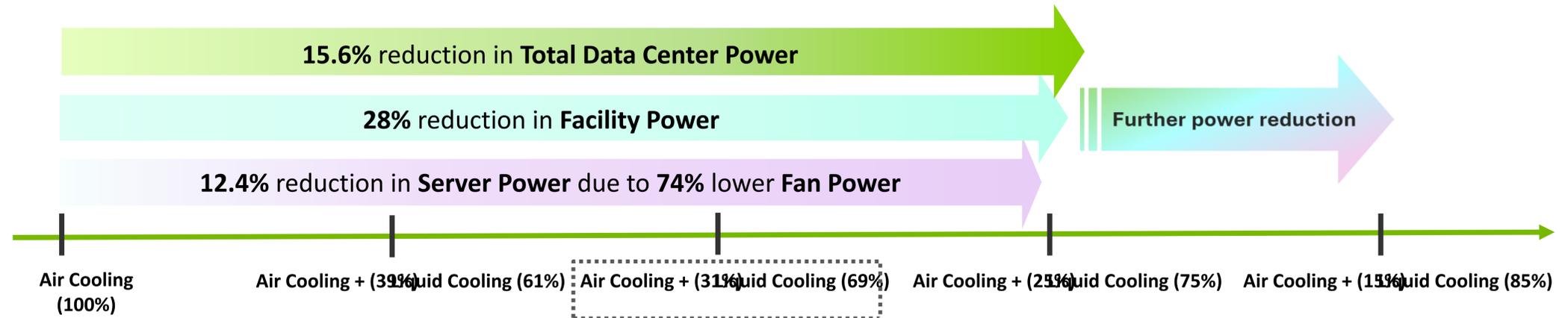


# Research Focus: Data Center Efficiency & TCO Analysis

## Energy Efficiency Main Contributors



## Air Cooling vs. Hybrid of Air & Liquid Cooling

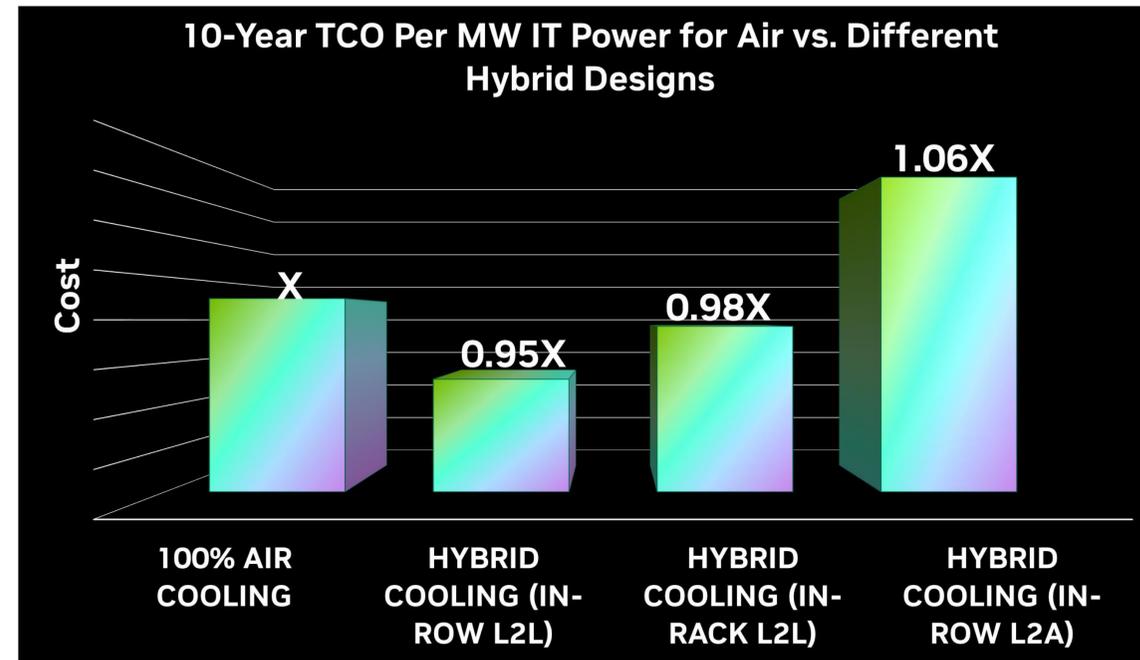


### Air Cooling (AC)

- Limited cooling capacity
- Lower energy efficiency
- Higher water usage
- Higher noise level
- Lower upfront cost
- Higher operation cost

### Liquid Cooling (LC)

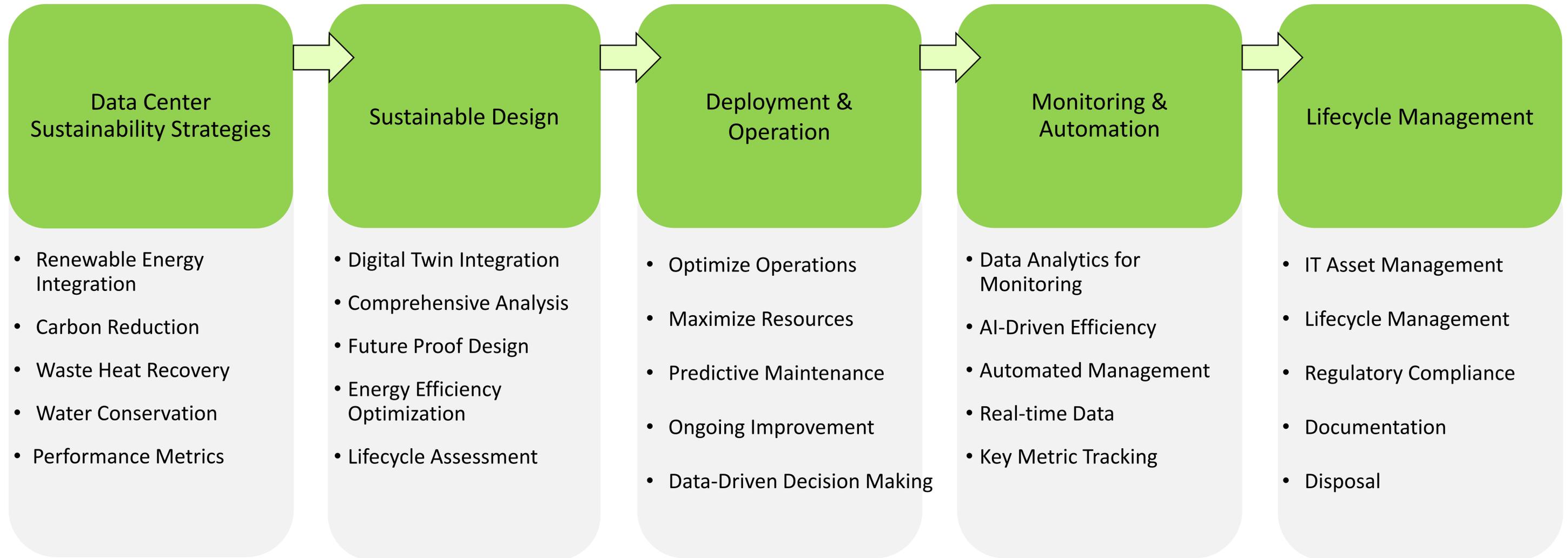
- Improved cooling efficiency
- Higher upfront cost
- Lower operation cost
- Increased complexity
- Risk of leaks
- Extended IT server life
- Heat Reuse possibility



➤ Both power efficiency and TCO analysis are based on mechanical cooling design only.

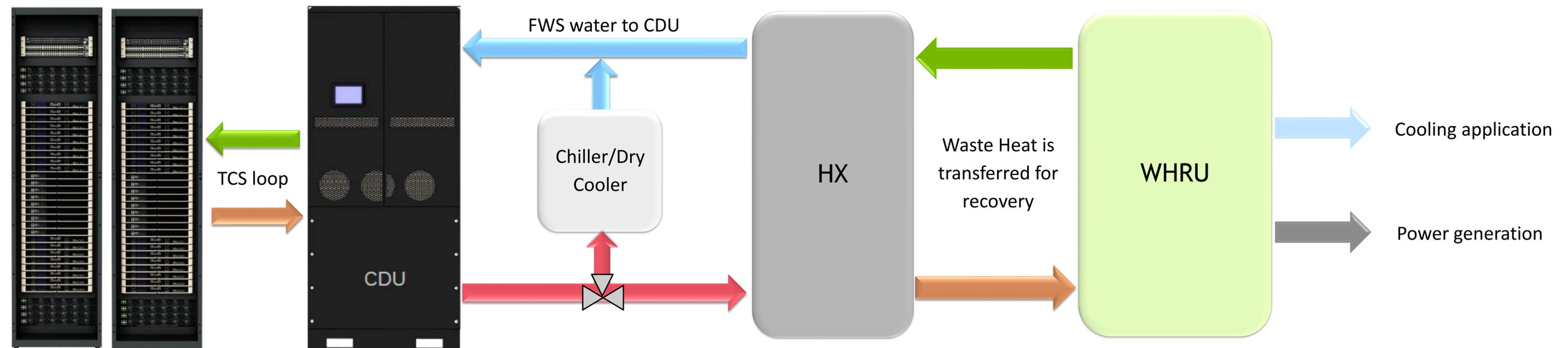
Ref: [A Comparative Data Center Energy Efficiency and TCO Analysis for Different Cooling Technologies | InterPACK | ASME Digital Collection](#)

# Data Center Sustainability



# Waste Heat Recovery Project

- Reducing power consumption by utilizing waste heat from IT equipment & design optimization
- Collaborating with research centers to explore possibilities to recover waste heat from liquid-cooled racks
- Developing and testing different prototypes to generate electricity from waste heat recovery unit (WHRU) to power cooling equipment such as adsorption/absorption chillers



# ARPA-E COOLERCHIPS Project: *OMNICOOL*

The Department of Energy's ARPA-E supports early-stage impactful energy technologies, with the COOLERCHIPS program focusing on efficient and reliable cooling for data centers, and Nvidia receiving the highest grant of \$5 million from the program's \$40 million fund.

## Objectives

- ❖ Boosting **energy efficiency** by employing hybrid D2C two-phase and single immersion cooling systems.
  - **Target:** PUE <1.05
- ❖ Elevating **power density** challenge by utilizing a compact flow distribution and heat rejection systems.
  - **Target:** >160 kW/ rack
- ❖ Overcoming **geolocation and weather constraints** deploying >1 MW compute power in remote and harsh environments.
  - **Target:** fit within ISO 40' container, Ambient temperature  $\geq 40$  °C
- ❖ Emphasizes **environmental impact** and **sustainability goals** by using Green refrigerants and achieving zero water consumption.
  - **Target:** GWP <1

## Innovations

- Integrating two electronic cooling approaches
- An innovative two-phase porous metal cold plate technology.
- Non-orthogonal, interlocking coil arrays for compact free coolers.
- In-Rack Distributed Pumping and Flow Separation System.
- Multi-scale flow distribution systems utilizing hierarchical architectures.

