



WaterSplit: Coordinated On-Site and Off-Site Water Allocation For Sustainable Datacenter Cooling



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Jiang**



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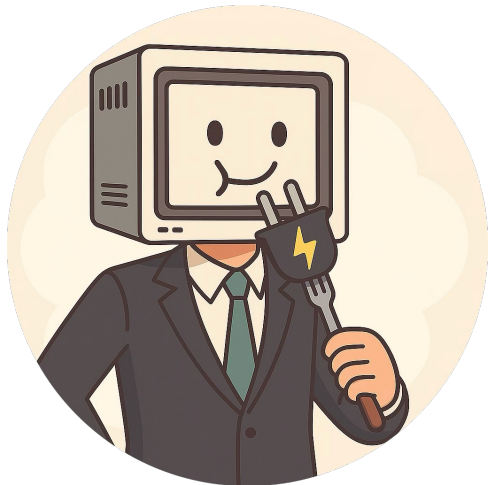
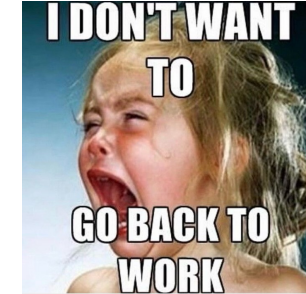


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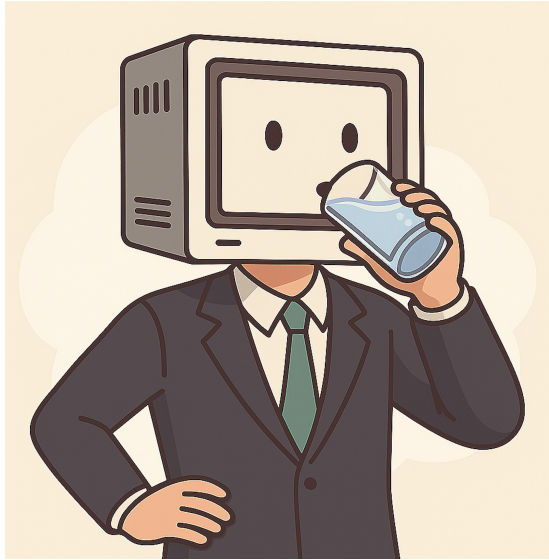


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Tiwari**

What if...



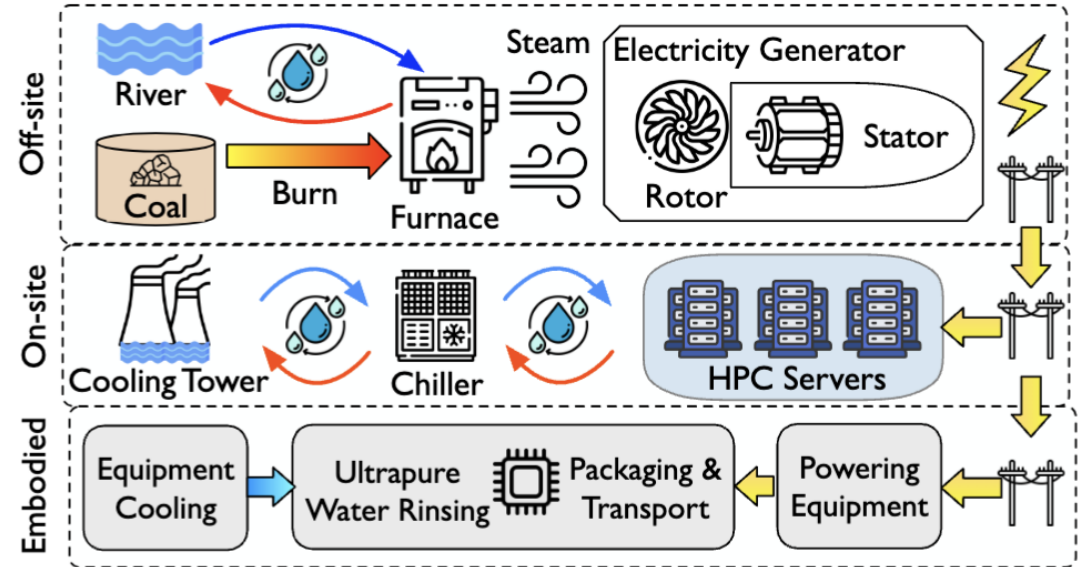
Datacenters Drink Huge Amounts of Water!



560 Billion Liters

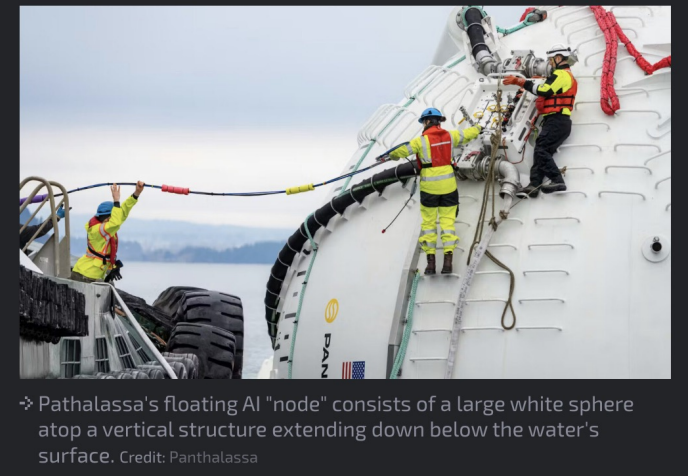
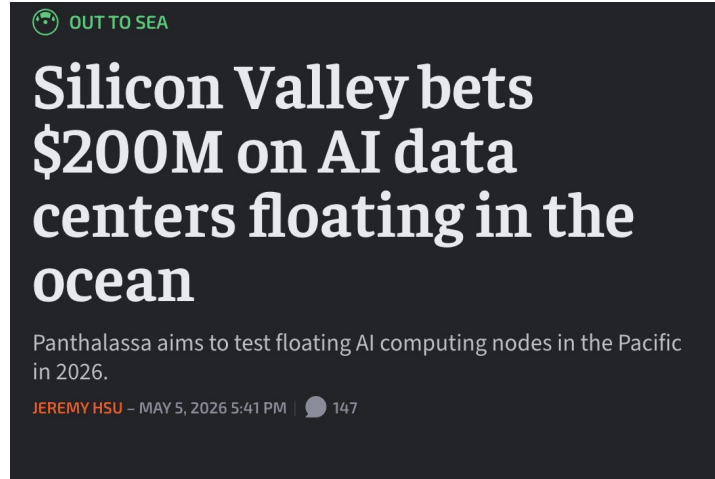


224,000



Datacenters consume huge amounts of water, the **water footprint** serves as a metric for **quantifying total water consumption**, encompassing the **on-site**, **off-site**, and **embodied** components.

Datacenters Are Going on a Water Diet

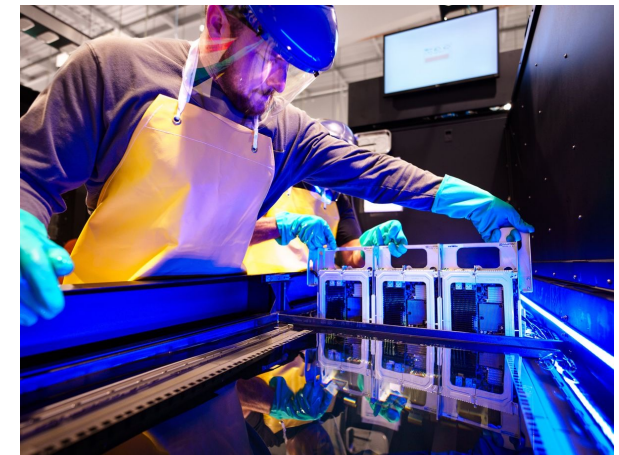


❖ Panthalassa's floating AI "node" consists of a large white sphere atop a vertical structure extending down below the water's surface. Credit: Panthalassa

Microsoft Unveils Zero-Water Datacenter Design to Slash Cooling Water Use

by ESG News • December 12, 2024

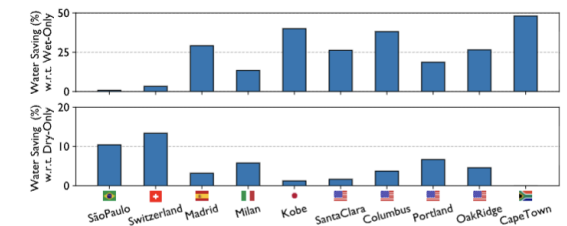
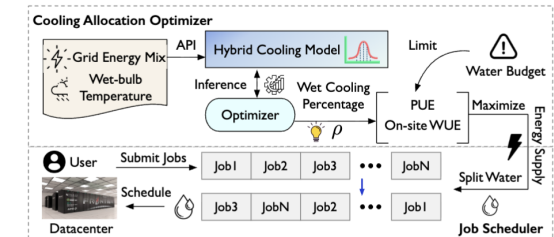
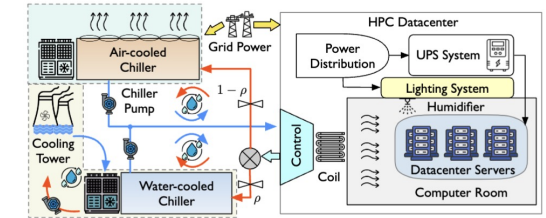
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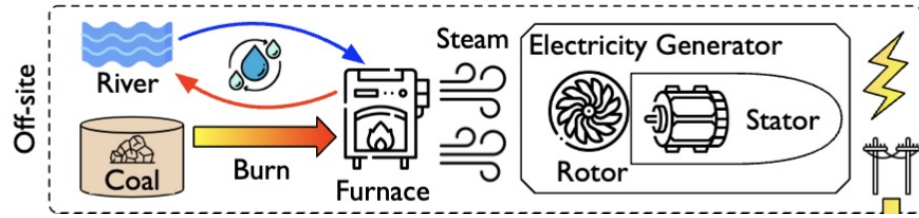
WaterSplit: Executive Summary



- ✓ **A Hybrid Cooling System Prototype:** Build a hybrid cooling model that integrates wet and dry cooling mechanisms with major datacenter infrastructure components.
- ✓ **Two-level Water-aware Optimizer:** A two-level water-aware optimization framework that jointly manages cooling allocation and workload scheduling under limited water budgets.
- ✓ **Comprehensive Evaluations of WaterSplit:** Evaluated across 10 regions with real-world weather data, datacenter workloads, and workload traces; compared against three state-of-the-art baselines to show improved water-aware resource management.



Introduction of Water Footprint

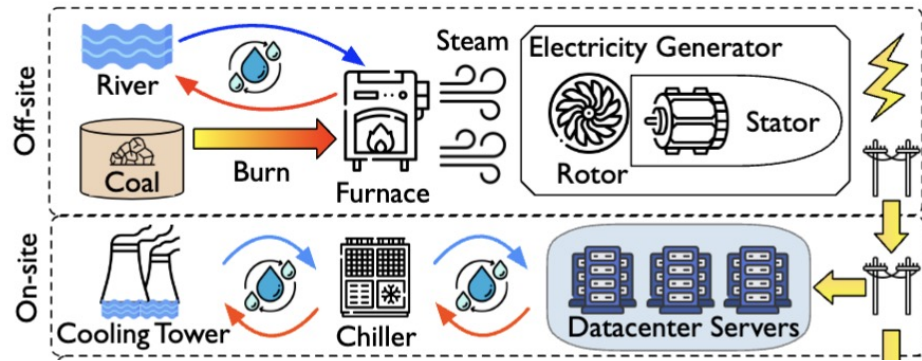


Off-site Water Footprint

$$W_{\text{off}} = \text{WUE}_{\text{off}} \cdot E_T \cdot \text{PUE}$$

Off-site Water Footprint: Refers to the amount of water consumed during power generation. The off-site WUE is the metric that determines the off-site water footprint.

Introduction of Water Footprint



Off-site Water Footprint

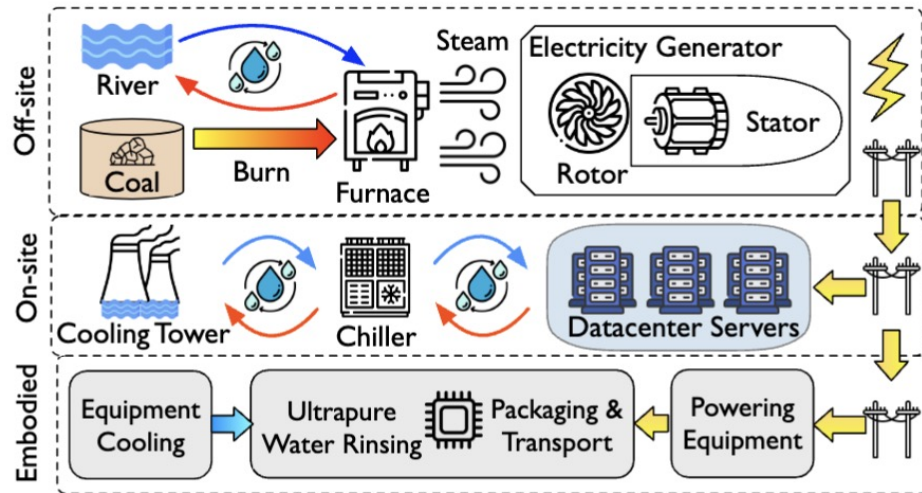
$$W_{\text{off}} = \text{WUE}_{\text{off}} \cdot E_T \cdot \text{PUE}$$

On-site Water Footprint

$$W_{\text{on}} = \text{WUE}_{\text{on}} \cdot E_T$$

On-site Water Footprint: is consumed during the cooling process in the systems. On-site WUE quantifies the amount of water needed to cool one unit of energy (lower is better).

Introduction of Water Footprint



Off-site Water Footprint

$$W_{\text{off}} = \text{WUE}_{\text{off}} \cdot E_T \cdot \text{PUE}$$

On-site Water Footprint

$$W_{\text{on}} = \text{WUE}_{\text{on}} \cdot E_T$$

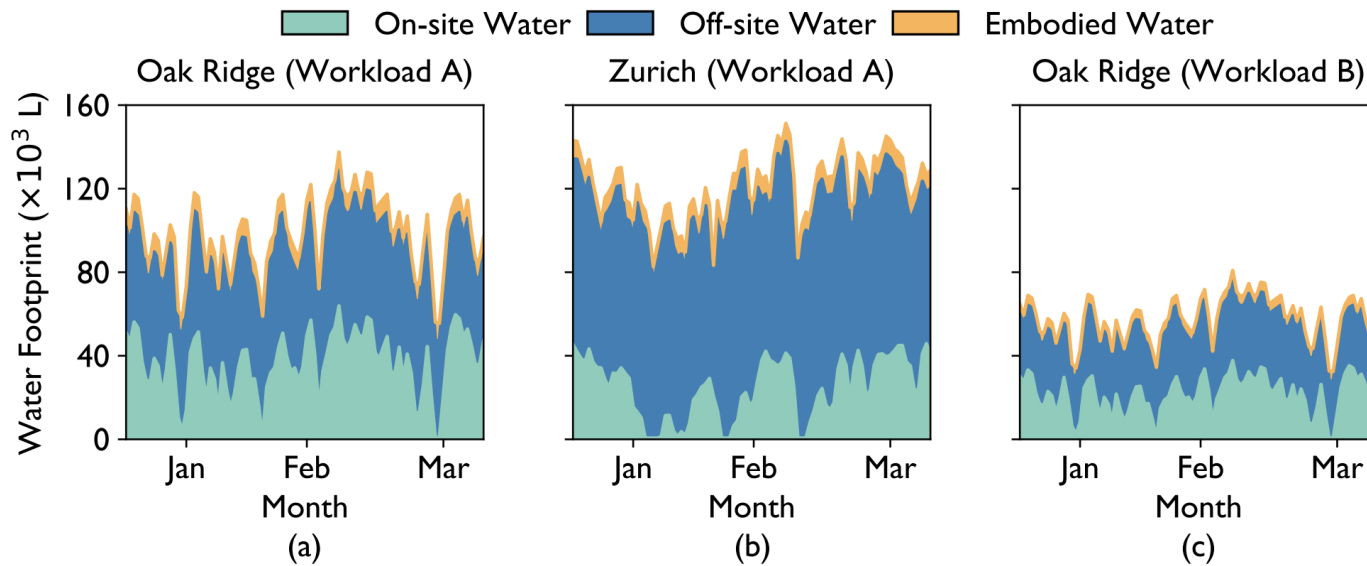
Embodied Water Footprint

Embodied Water Footprint: water consumed during hardware packaging and manufacturing.

Water Stress Factor: capture the regional scarcity of water usage

$$W^{\text{WSF}} = (W_{\text{on}} + W_{\text{off}}) \cdot \text{WSF}$$

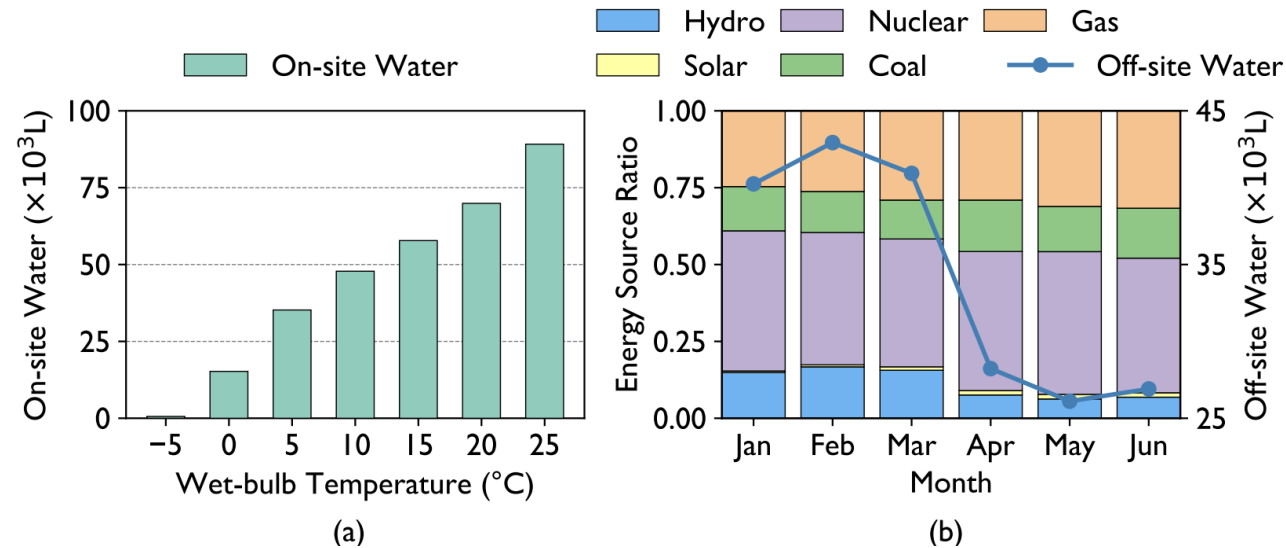
Water Footprint Components Inside Datacenter Systems



Applications	Metrics	Languages	Description
Mediawiki	Peak RPS	PHP, Hack	Web Serving (Facebook)
FeedSim	RPS under SLO	C++	Object Aggregation
DjangoBench	Peak RPS	Python, C++	Web Serving (Instagram)
VideoTranscodeBench	Throughput	C++	Video Processing
LLM-bench	Inference Latency	Python	LLM Inference using CPU

The water consumption in operating the datacenter system has three components: **on-site water footprint** (water for cooling), **off-site water footprint** (water for power generation), and **embodied water footprint** (water for hardware manufacturing).

Water Footprint Components inside Datacenter Systems



Energy Source	Hydro	Geothermal	Nuclear	Oil	Coal	Biomass	Gas	Solar	Wind
WUE _{off} (L/kWh)	17	5.8	2.6	1.79	1.51	1.14	1.02	0.06	0

The on-site water consumption is driven by local weather conditions. In contrast, the off-site water consumption varies due to the availability of the local energy mix and its respective off-site WUE. The usage of water-intensive energy sources for power generation impacts the off-site water.

Cooling System: A Real Water Bottleneck in Datacenter



Wet Cooling

Off-site 

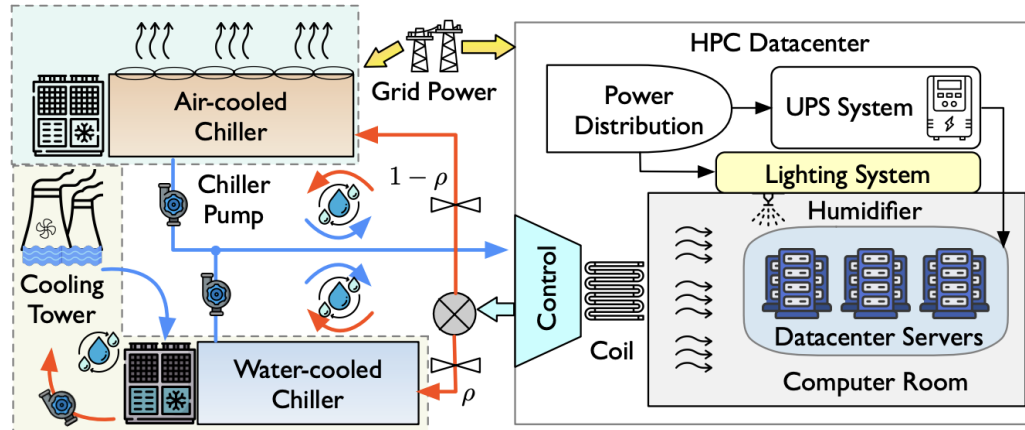
On-site 



Dry Cooling

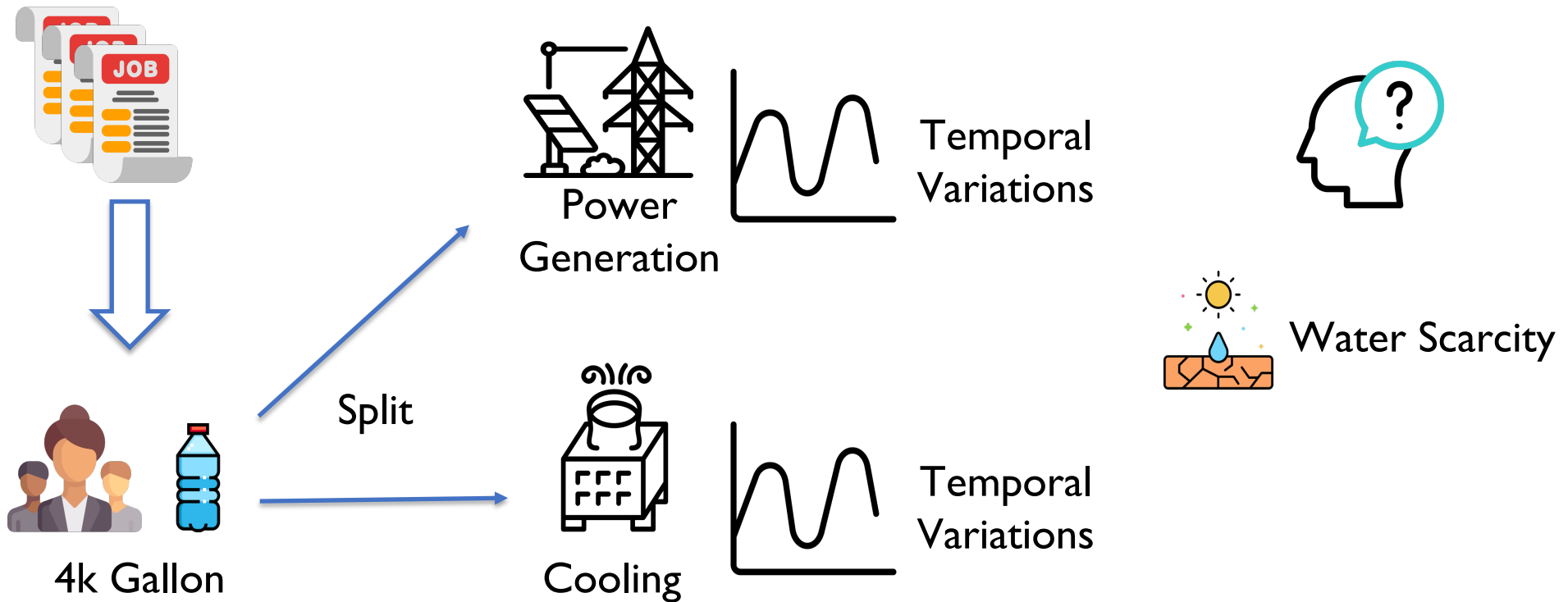
Off-site 

On-site 



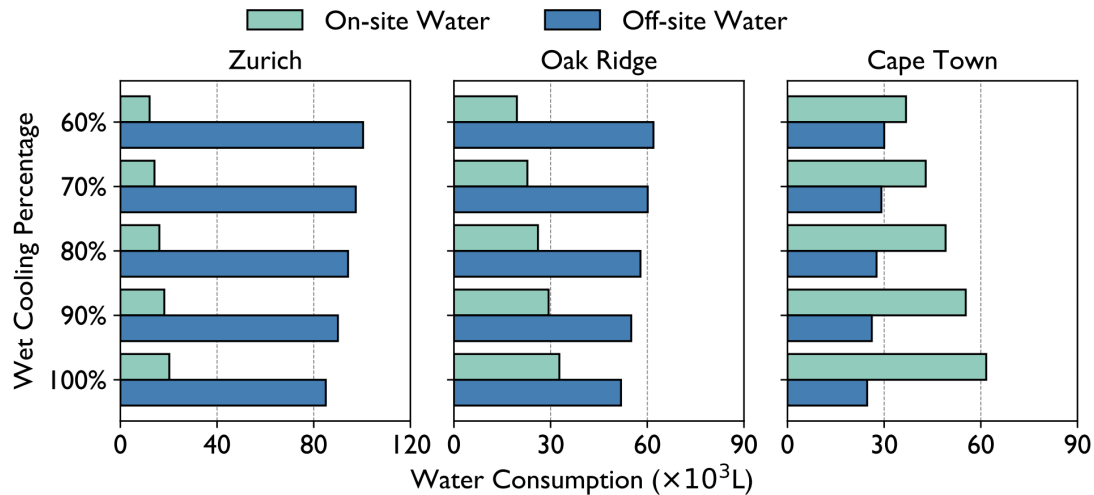
To mitigate the water footprint while maintaining energy efficiency, **hybrid cooling systems** have been proposed as a promising alternative.

How to choose different water diet?

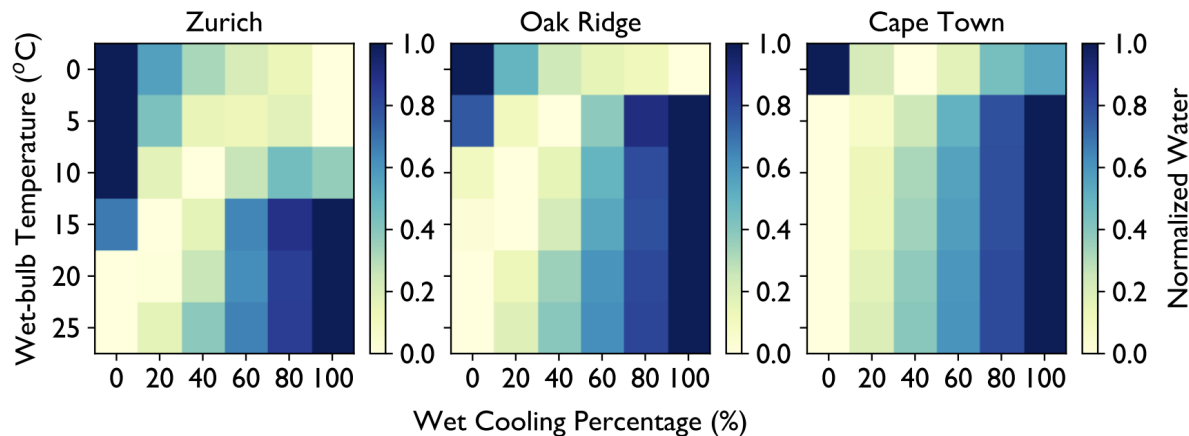


How to allocate limited water resources between power generation and cooling to maintain system efficiency?

Off-site Water vs On-site Water: Trade-offs

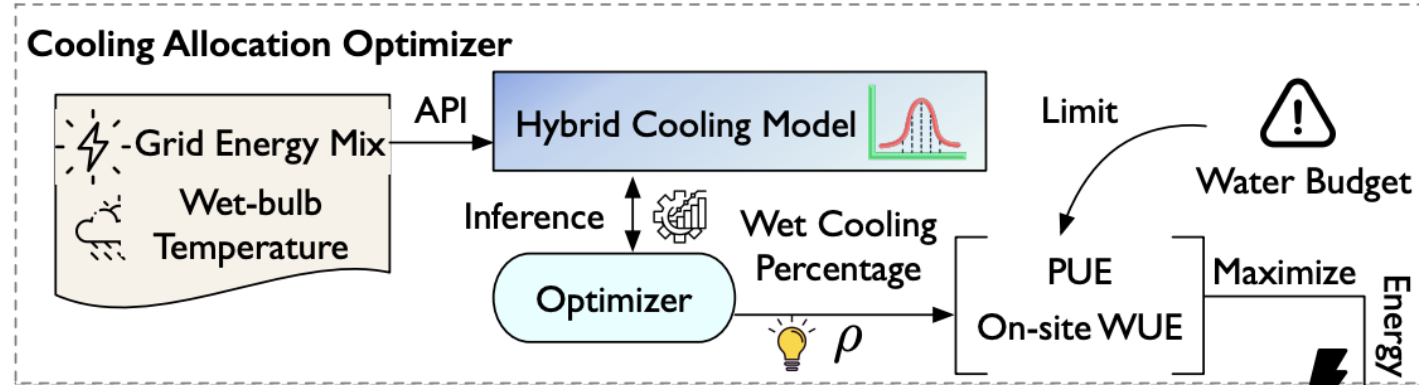


On-site and off-site water footprints have trade-offs: reducing on-site water usage can raise PUE, increasing power demand.



Optimizing datacenter water footprint is challenging because control knobs create trade-offs between on-site and off-site water use.

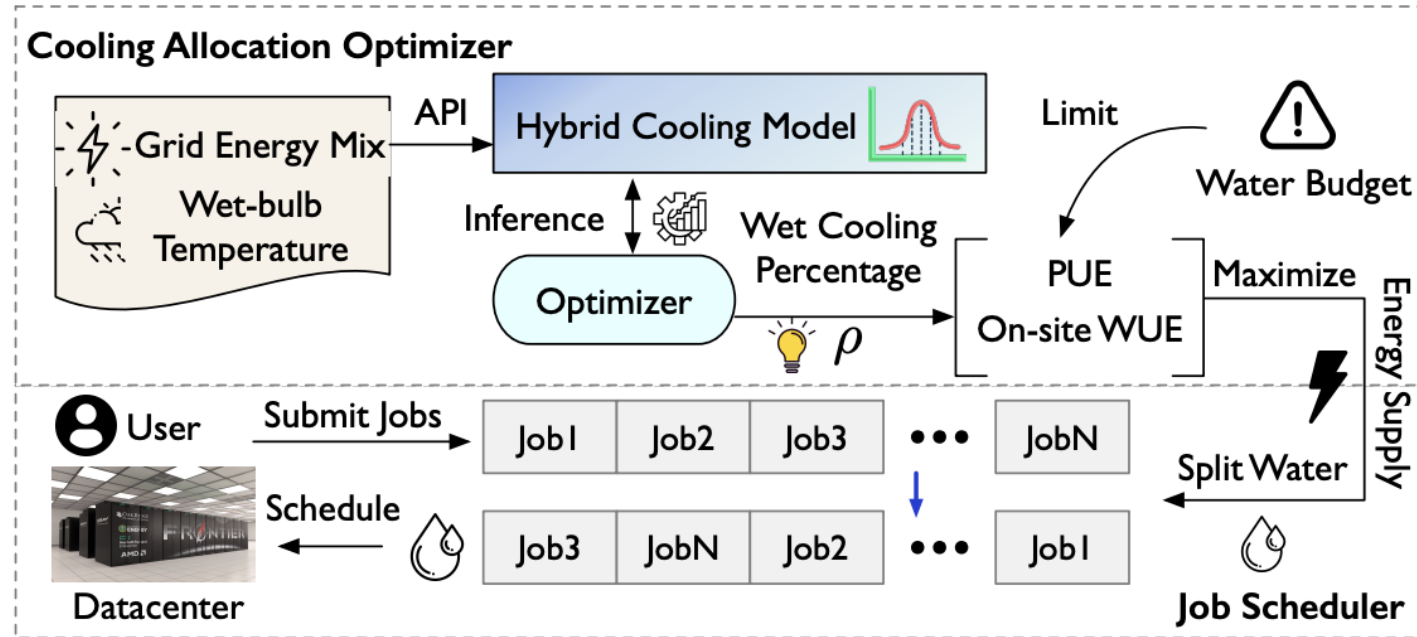
Design of WaterSplit



$$\sum_{t \in \mathcal{T}_k} (W_{\text{on}}^t + W_{\text{off}}^t) \leq W_{\text{budget}}^T, \quad \forall k$$

$$f = \max_{\rho \in [0,1]} E_{\text{DC}}^T$$

Design of WaterSplit



$$\text{priority}(j_i) = \hat{W}_i - \gamma \times \text{WaitTime}$$

$$\max \sum_{j_i \in \mathcal{J}} \mathbb{1}_{\text{scheduled}(j_i)}$$

WaterSplit allocates water under a budget by choosing the wet-cooling percentage and job schedule to balance water use and energy supply.

Experimental Methodology

Setup

- ☐ AWS m5.metal
- ☐ Hybrid Cooling Model

Metrics

- ☐ Water Footprint
- ☐ Queuing Time

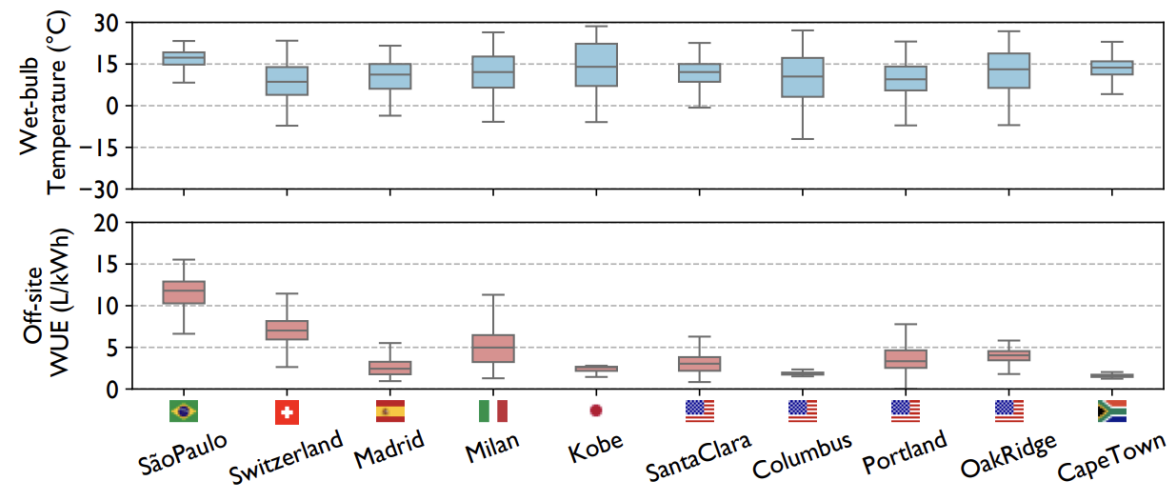
Workloads

- ☐ Meta DCPerf
- ☐ CPU-based LLM Serving

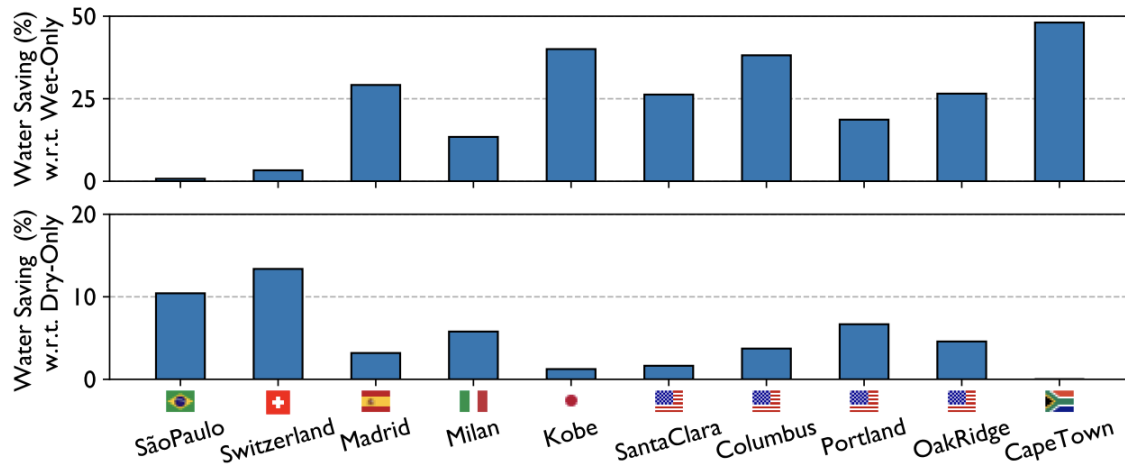
Schemes

- ☐ Dry-only, Wet-Only
- ☐ Static-Hybrid
- ☐ Temperature-Adaptive
- ☐ WaterWise, WACE, SLIT

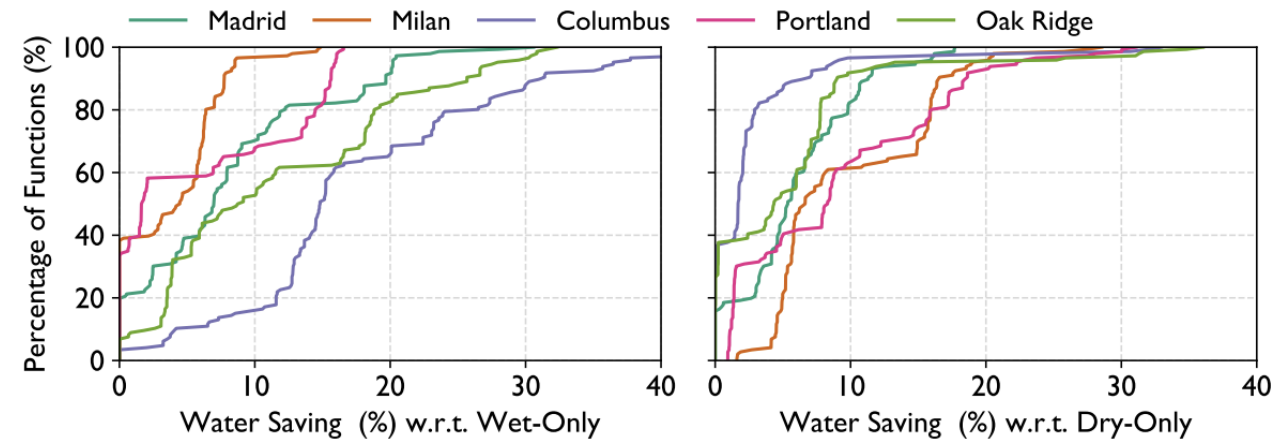
Real Outside
Environmental Data



WaterSplit is Effective at Optimizing Water Footprint



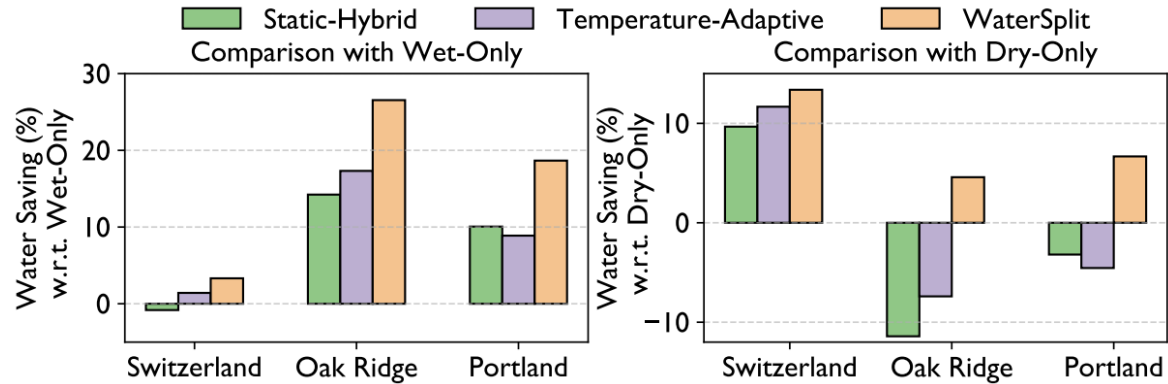
Overall Water Savings



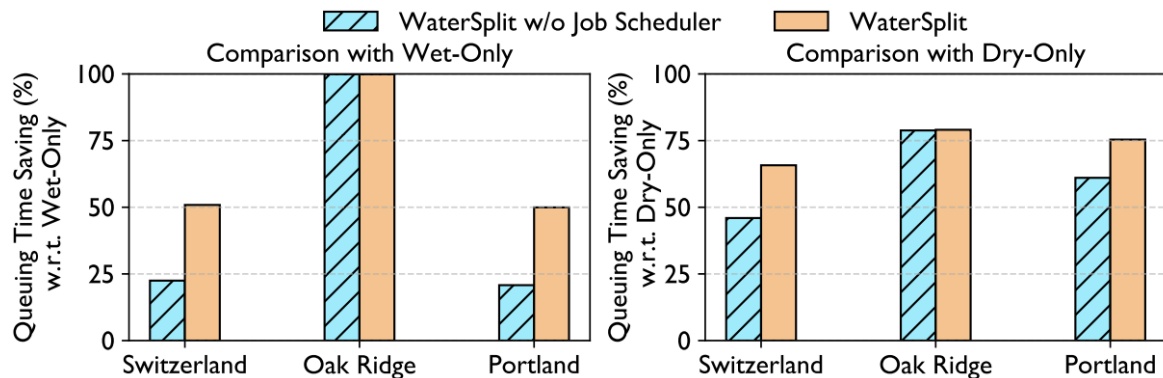
CDF

The effectiveness of hybrid cooling is **region-dependent**. Hybrid cooling provides benefits primarily in **transitional climates**, and its long-term suitability requires evaluation over extended observation periods (more than one year).

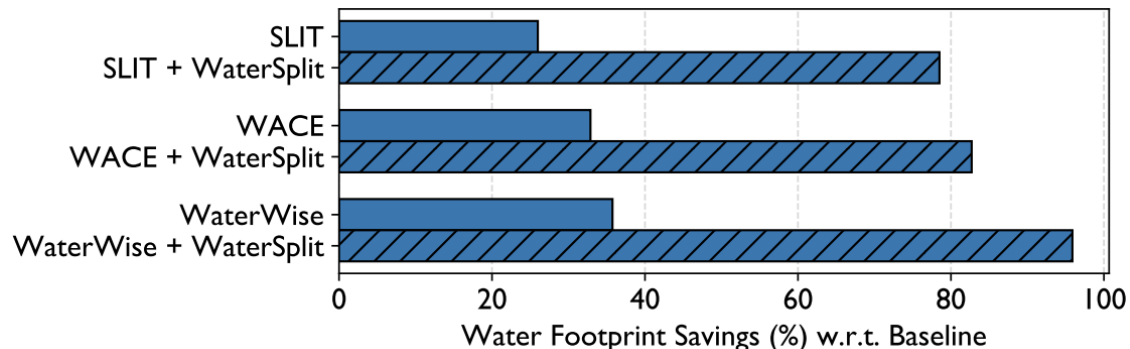
WaterSplit is Effective at Optimizing Water Footprint



WaterSplit achieves greater water savings than other hybrid cooling strategies.

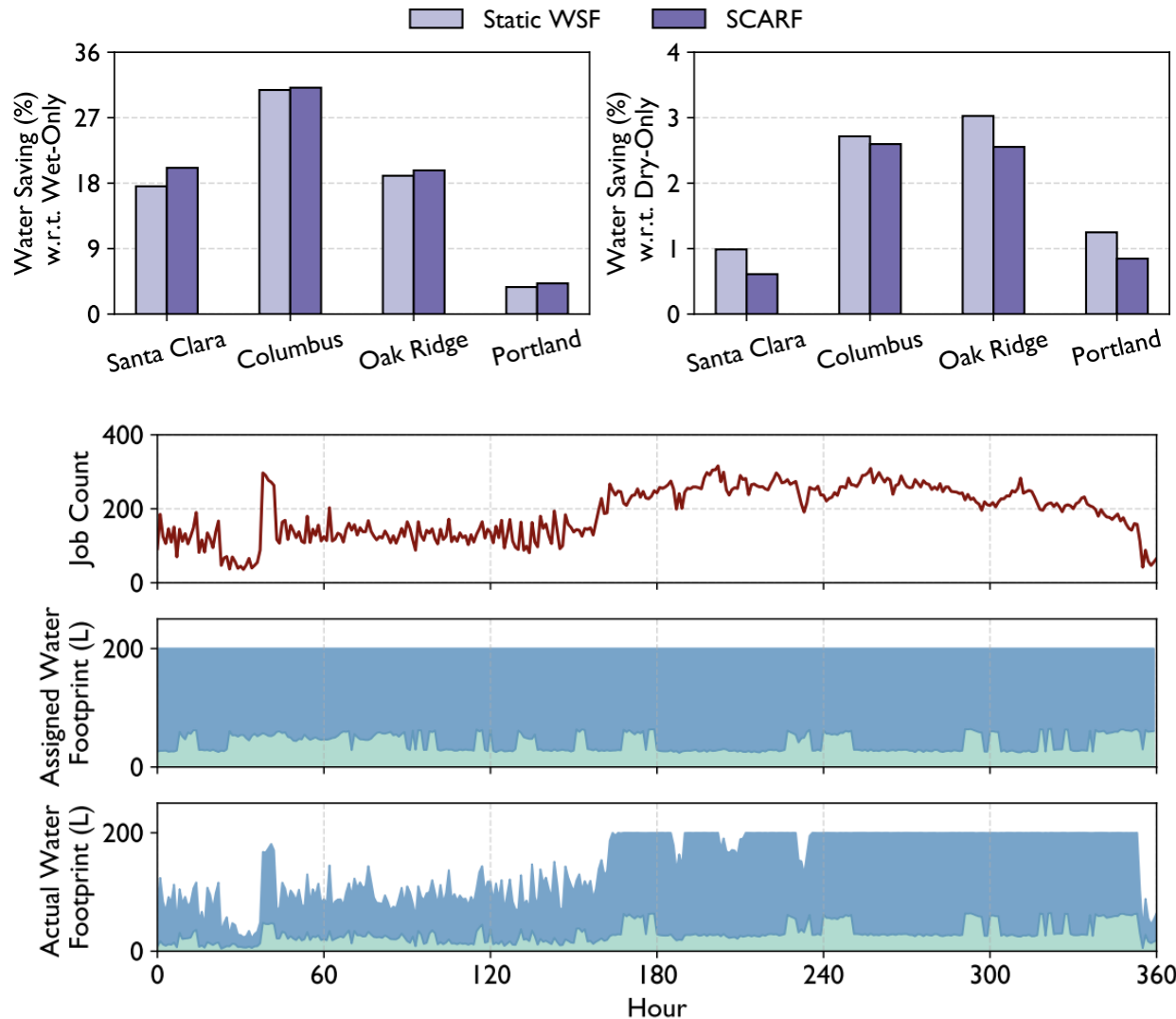


Water-aware Scheduler reduces the job queuing time.



WaterSplit can further increase water savings compared to existing state-of-the-art approaches.

WaterSplit is Robust with Scarcity-Aware Water Budgets



WaterSplit is still effective after embedding different Water Stress Factors.

Water budget is useful to regulate and maintain a stable water usage, considering both on-site and off-site water footprint. However, it must be carefully managed to achieve acceptable queuing delays.

WaterSplit: Summary Key Contributions

- ✓ WaterSplit reveals the trade-off between on-site and off-site water footprints in hybrid-cooled datacenters.
- ✓ WaterSplit builds a hybrid cooling model to estimate PUE and on-site WUE under different wet-cooling percentages, using wet-bulb temperature and regional energy mix.
- ✓ WaterSplit introduces a two-level water-aware optimizer that jointly selects the wet-cooling percentage and schedules jobs under a water budget, improving throughput while avoiding starvation.
- ✓ WaterSplit reduces water footprint across diverse regions and can further improve existing water-aware schemes.



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