

ON THE THREE LAYERS OF SUSTAINABLE COMPUTING RESEARCH

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Lead Topical Editor, IEEE Transactions on Computers (TC)
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Sustainable Architectures and Infrastructure Laboratory

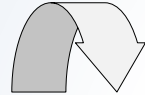
Department of Computer Science and Engineering
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<http://www.cs.sjtu.edu.cn/~lichao>

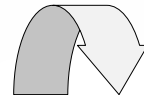
The Technology Trend of Computing Infrastructure



PC Era



Internet Era

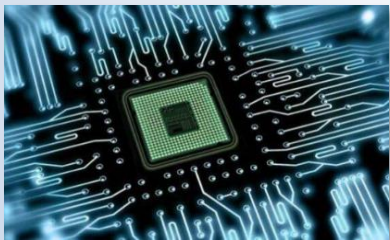
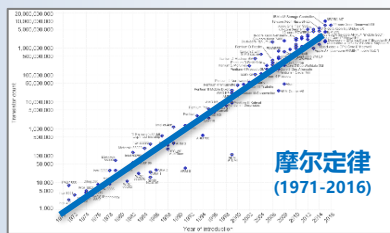


Cloud Era



AI+ Era

Support



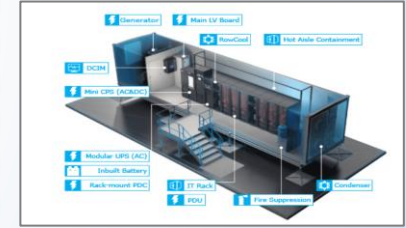
Core / Server




Server Cluster



Big Data Center



Cloud-Edge

A photograph of an industrial facility, likely a power plant or refinery, with numerous smokestacks emitting thick, dark plumes of smoke that rise into the sky. The sky is a vibrant orange and red, suggesting a sunset or sunrise. The foreground is dark, with some blurred lights from a road or waterway.

Tsunami of Data: Could Consume **20% of
Global Electricity by 2025 ...**

climatechangenews.com

- 1 Sustainable Computing: An Introduction**

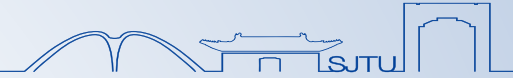
- 2 Three Aspects of Sustainable Computing**

- 3 Challenges of Green Cloud Computing**

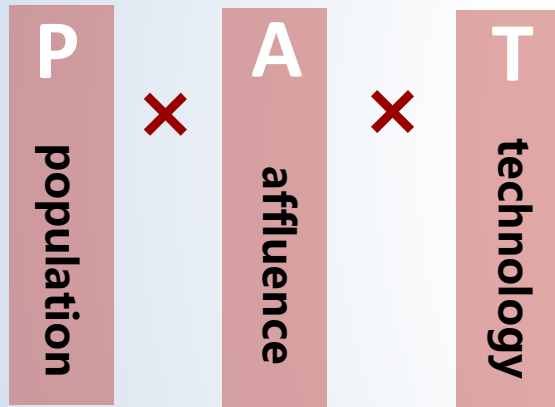
- 4 Summary and Discussions**



Different Interpretations of Sustainability

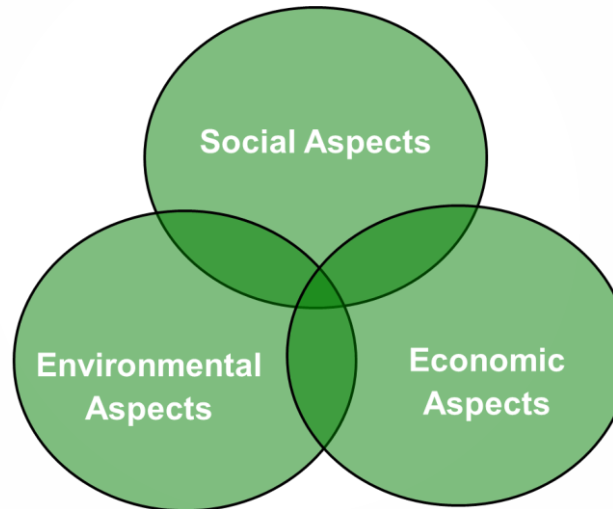


There are lots of discussions on the meanings of sustainability



**The IPAT Equation
(1970s)**

A rough estimation of environmental impact



**The Three Pillar
(1980s)**

We must balance three key elements in our design

1. People

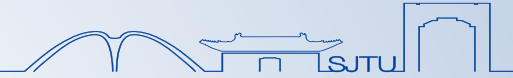
2. Prosperity

3. Planet

**Triple Bottom Line
(1990s)**

It is important to keep three key bottom lines in mind

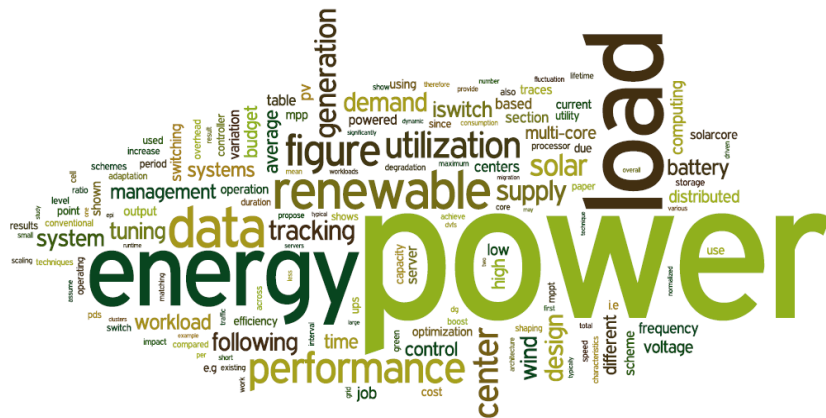
When Computing Meets Sustainability



Sustainable Computing is not Computational Sustainability

Sustainable Computing

- developing energy-efficient, low-carbon computing systems and apps



Computational Sustainability

- Leveraging computing techniques to improve the sustainability



Sustainable Computing is a Very Hot Topic



Sustainability has attracted great attention from researchers



ENERGY

Recalibrating global data center energy-use estimates

Growth in energy use has slowed owing to efficiency gains that smart policies can help maintain in the near term

As demand for data centers rises, energy efficiency improvements to the IT devices and cooling systems they house can keep energy use in check.

Bottom-up analyses tend to best reflect this broad range of factors, generating the most credible historical and near-term energy-use estimates (7). Despite several recent national studies (8), the latest fully replicable bottom-up estimates of global data center energy use appeared nearly a decade ago. These estimates suggested that the worldwide energy use of data centers had grown from 153 terawatt-hours (TWh) in 2005 to between 203 and 273 TWh by 2010, totaling 1.1 to 1.5% of global electricity use (9).

Since 2010, however, the data center landscape has changed dramatically (see the first figure). By 2018, global data center workloads and compute instances had increased more than sixfold, whereas data center internet protocol (IP) traffic had increased by more than 10-fold (7). Data center storage capacity has also grown rapidly, increasing by an estimated factor of 25 over the same time period (1, 8). There has been a tendency among analysts to use such service demand trends to simply extrapolate earlier bottom-up energy values, leading to unreliable predictions of current and future global data center energy use (3-5). They might, for example, scale up previous bot-

“...the computing community should embrace a grand challenge to reduce the carbon-emissions and environmental impact of computing in absolute terms” - CACM, 2022

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EDITOR'S LETTER

Computing's Grand Challenge for Sustainability

By Andrew A. Chien

Communications of the ACM, October 2022, Vol. 65 No. 10, Page 5

10.1145/3559163

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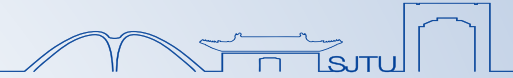


SHARE:



“...new technologies is needed to manage future energy demand growth ... once current efficiency trends reach their feasible limits” - Science, 2020

There are Many Research Opportunities



Both NSFC and NSF today put an emphasis on sustainability

NSFC of China

-- Sustainable Development International Cooperation Program 2022



国家自然科学基金委员会
National Natural Science Foundation of China

Sustainable Development International Cooperation Program 2022

Call for Proposals

日期 2022-04-25 来源: 作者: 【大 中 小】 【打印】 【关闭】

I Background

A systematic understanding of the synergies and conflicts among Sustainable Development Goals (SDGs) is of great significance for balancing the economic, social, and environmental dimensions of sustainable development and for the ultimate realization of the SDGs. With the theme of "human-environment system dynamics and UN' s SDGs", NSFC and international partners launch the program on Sustainable Development International Cooperation (SDIC) to contribute to the global effort for a sustainable future.

NSF of USA

-- Dear Colleague Letter: Design for Sustainability in Computing



NATIONAL SCIENCE FOUNDATION
2415 EISENHOWER AVENUE
ALEXANDRIA, VIRGINIA 22314

NSF 22-060

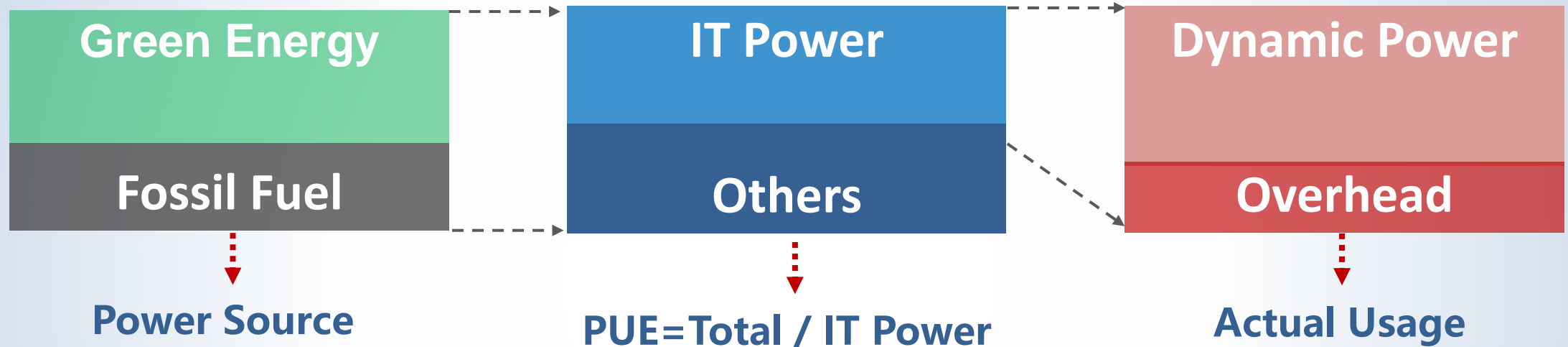
Dear Colleague Letter: Design for Sustainability in Computing

March 15, 2022

Dear Colleagues:

Environmental impacts of computing technologies extend well beyond their energy consumption and require a holistic focus on broader sustainability. Negative impacts of greenhouse gas emissions, depletion of rare earth elements, and e-waste are exacerbated by the proliferation of computing throughout society and treatment of computing systems as disposable commodities with planned obsolescence. Furthermore, environmental concerns

Related Research (1): Defining New Metrics

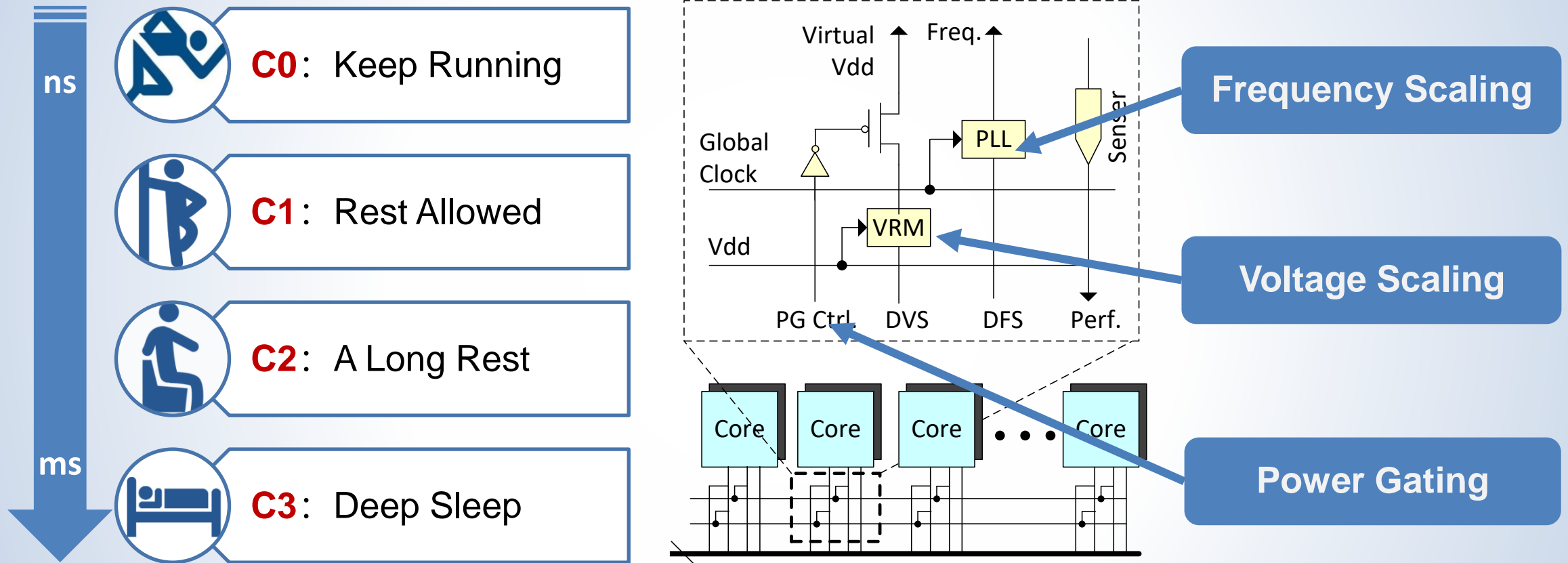
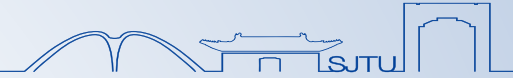


Low-PUE Does Not Guarantee Sustainability, we need to re-design the metric to take into account other factors. For example:

$$\frac{E_{green}}{E_{total}} \times \frac{E_{IT_d}}{E_{total}}$$

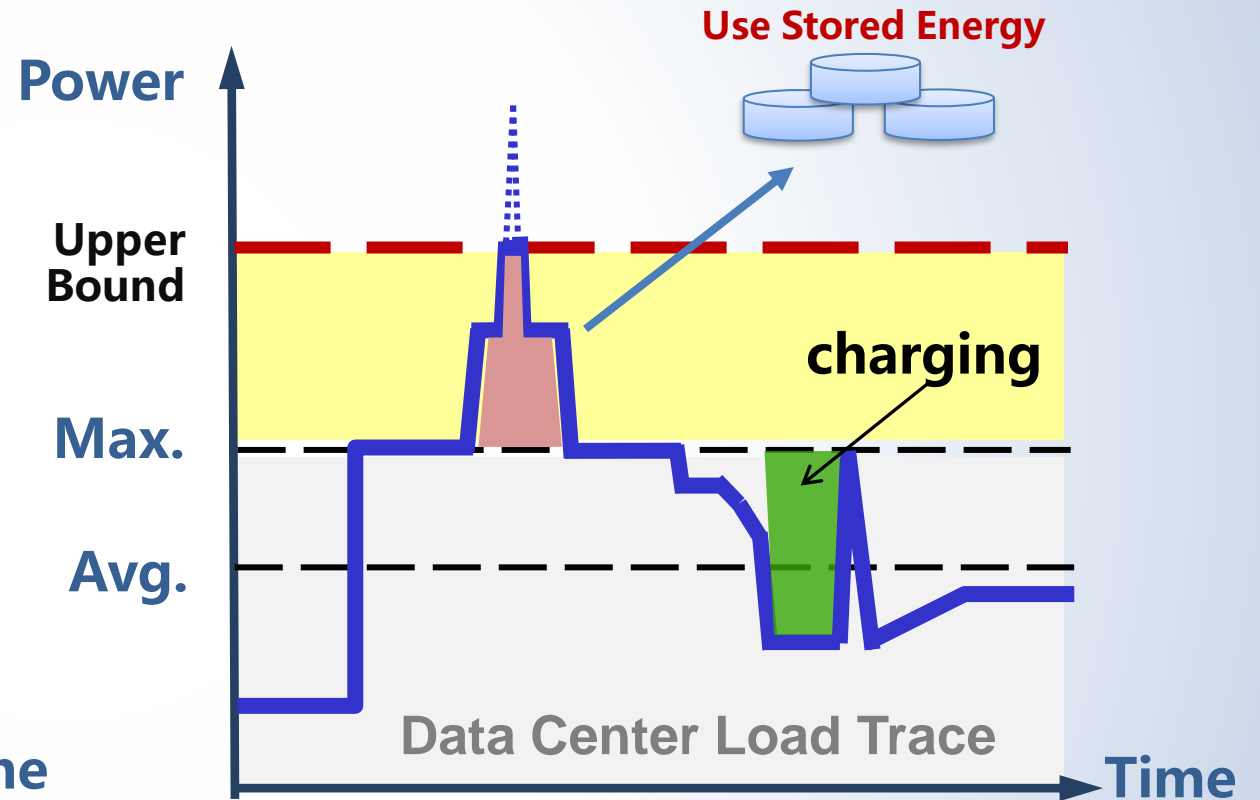
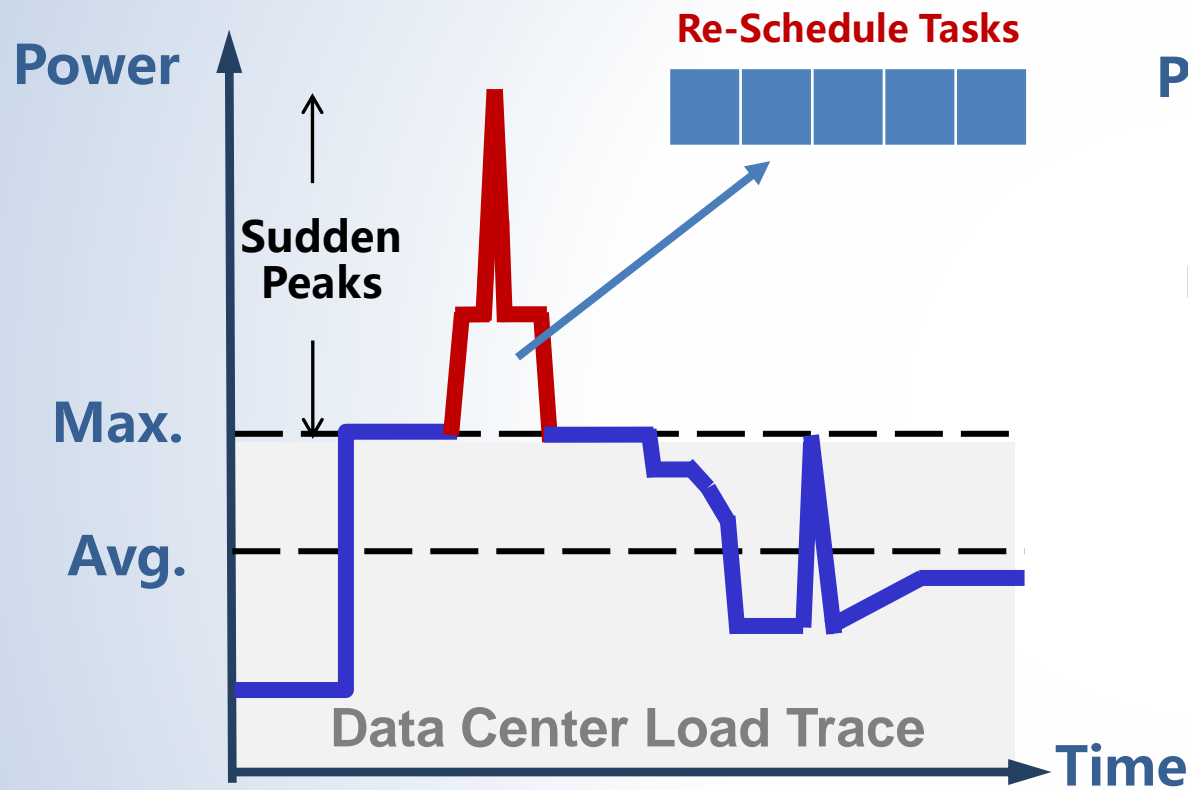
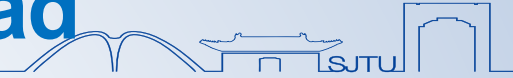
By defining appropriate metrics, we can better design system

Related Research (2): Tuning the Hardware



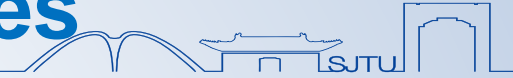
By enabling hardware management, we can save CPU energy

Related Research (3): Scheduling the Workload



By enabling hardware management, we can save CPU energy

Related Research (4): Tapping into Renewables



By innovating the infrastructure, we can greatly reduce carbon

How to Better Understand Sustainable Computing?



How can we classify different works on sustainable computing?

Topic 1. Defining New Metrics

Topic 2. Tuning the Hardware

Topic 3. Scheduling the Workload

Topic 4. Tapping into Renewables

Key Questions:

Are they similar?
Are they different?
What have been done?
What haven't been done?
Are there any opportunities?

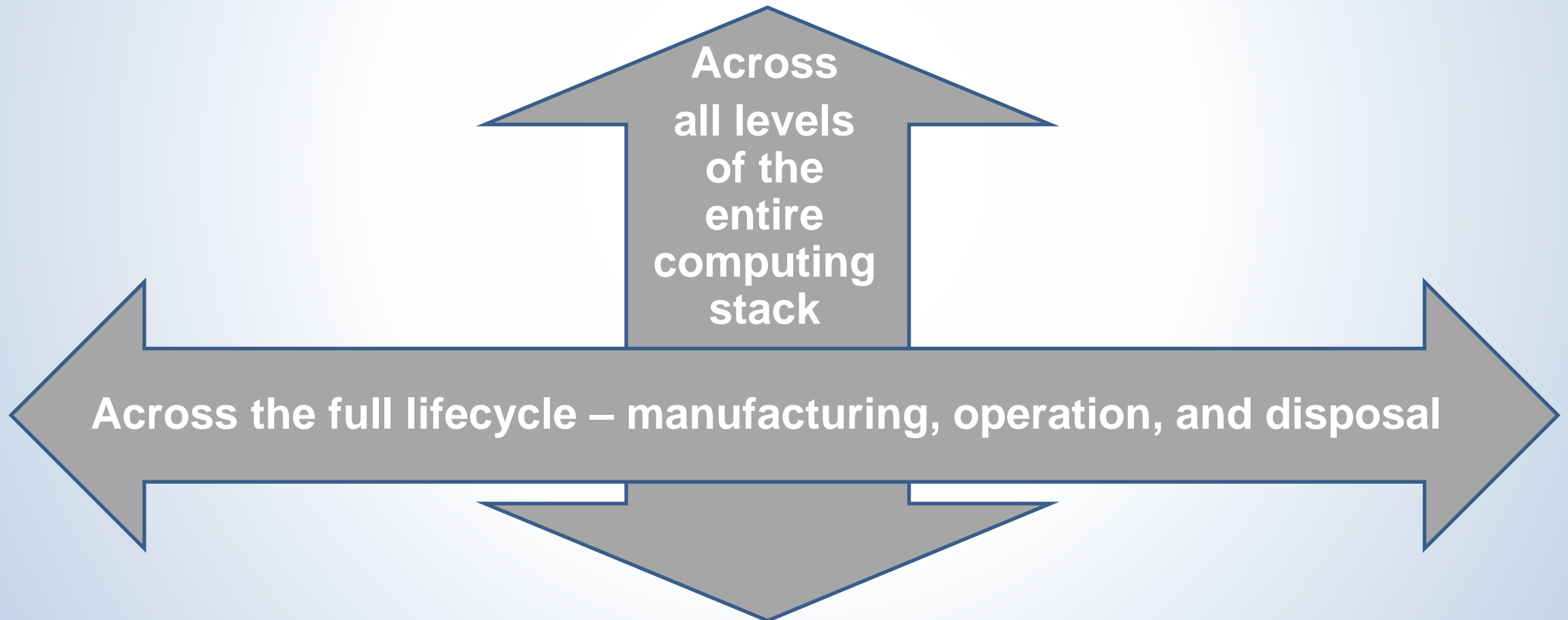
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Sustainable Computing Research: Simple Classification



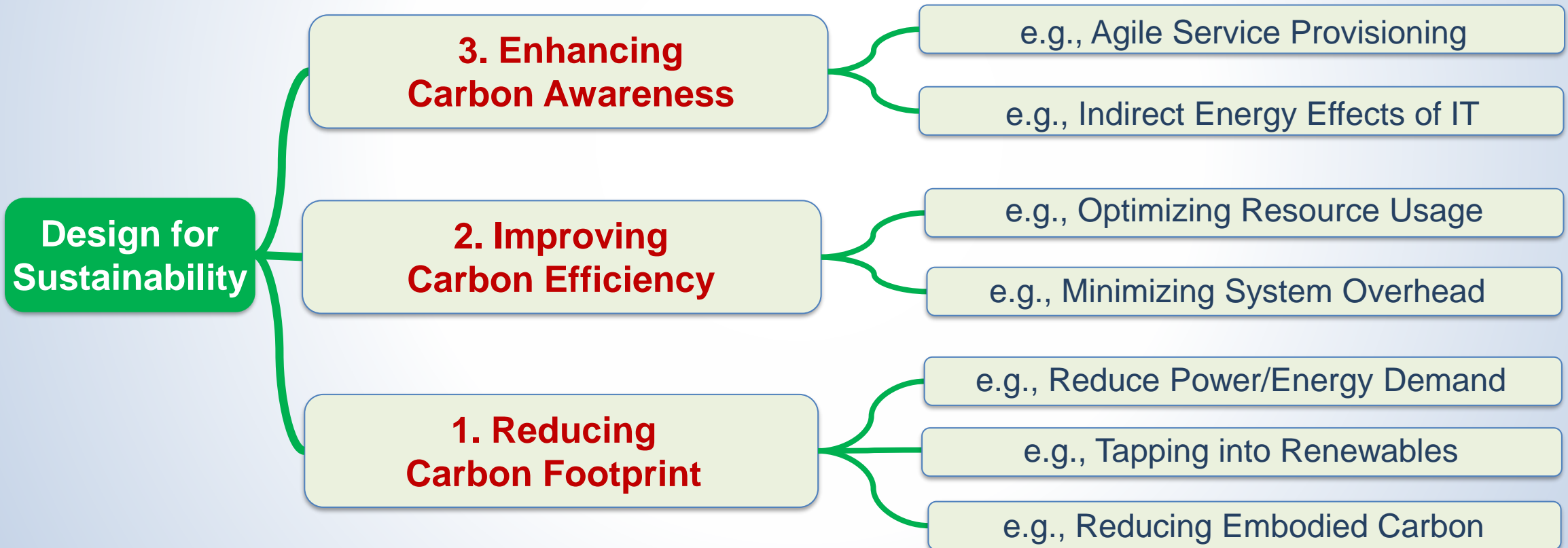
Sustainable computing research has two major dimensions



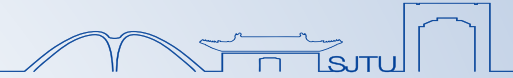
A Deeper Look at Sustainable Computing Research



There are three almost-orthogonal tiers

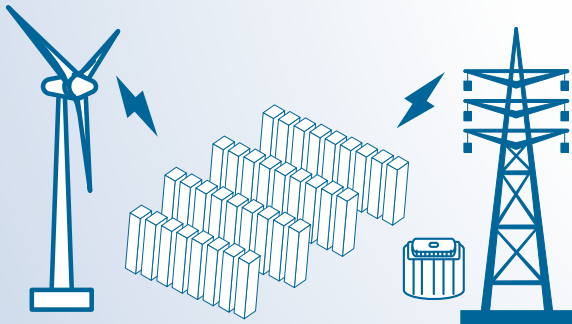


Tier-1. Reducing Carbon Footprint

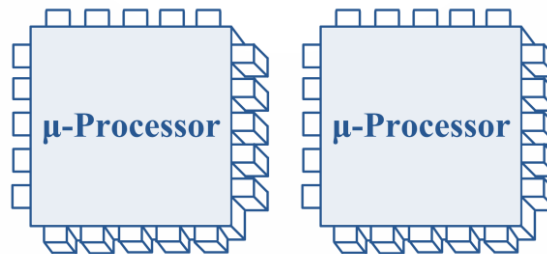


- **Design levels:** Hardware/Equipment Level
- **Key objective:** Minimizing the Power/Energy Usage and Carbon Footprint
 - 1) Reducing the reliance on fossil fuels and “brown” energy
 - 2) Reducing the energy/power consumption of the hardware device
 - 3) Taking embodied carbon footprint into account and recycle hardware

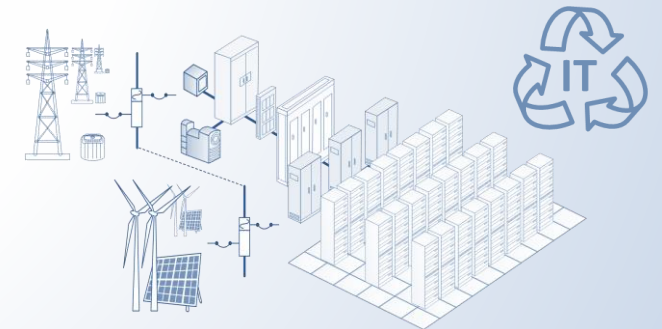
RES Integration



Low-Power Design



Embodied Carbon

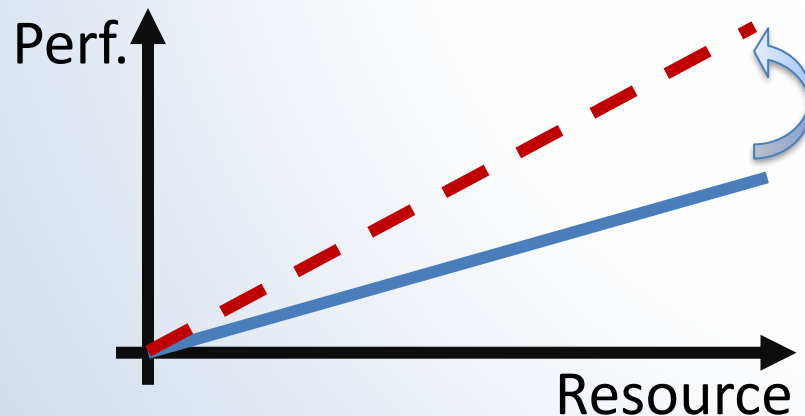


Tier-2. Improve Carbon Efficiency

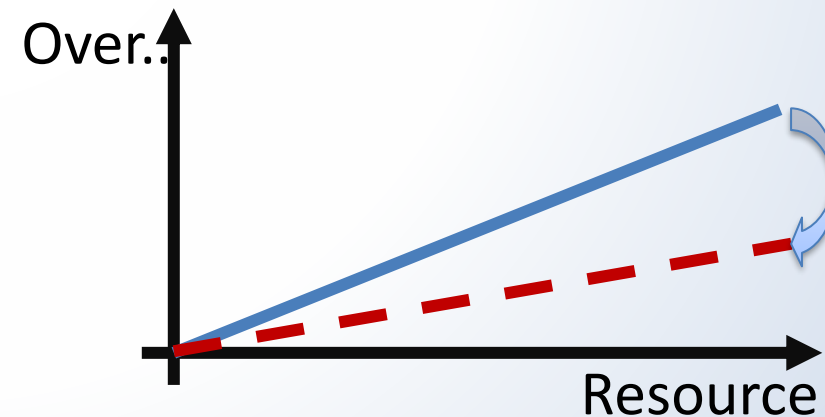


- **Design levels:** Architecture/System Level
- **Key objective:** Optimizing Perf. under the Given Energy/Carbon Budget
 - 1) Make the best use of any computing resources (CPU、 RAM、 Network, etc.)
 - Re-designing algorithm and system architecture to improve resource utilization/sharing
 - 2) Eliminate any unnecessary system operations or resource overhead
 - Keep data preprocessing, network re-configuration, load migration simple and efficient

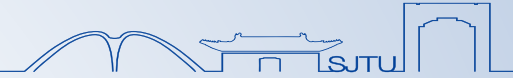
Boost Performance



Reduce Overhead

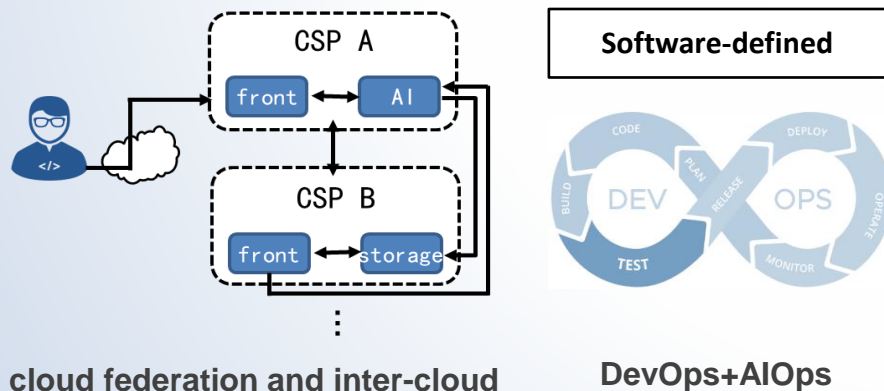


Tier-3. Enhancing Carbon Awareness



- **Design levels:** Application/Service Level
- **Key objective:** Minimizing environmental impact of IT services
 - Focusing on agile service provisioning to improve efficiency
 - If possible, upgrade rather than replace, unify rather than divide
 - Dealing with indirect carbon caused by the “rebound effect”
 - The carbon reduction achieved can be compromised by many other things

Agile Service Provisioning



Rebound Effect Aware

Low-efficiency VM



High-efficiency VM

Direct rebound: more consumption of the services

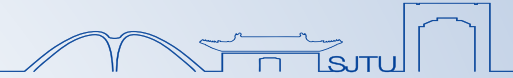
Efficient CPUs



Powerful GPUs

Indirect rebound: encourage the usage of other goods

Many Opportunities of Sustainable Computing



3. Carbon Awareness

Application/Service Level

Data-driven, AI-assisted design for continuous service optimization

2. Carbon Efficiency

Architecture/System Level

Fine-grained resource management in the “killer microseconds” era

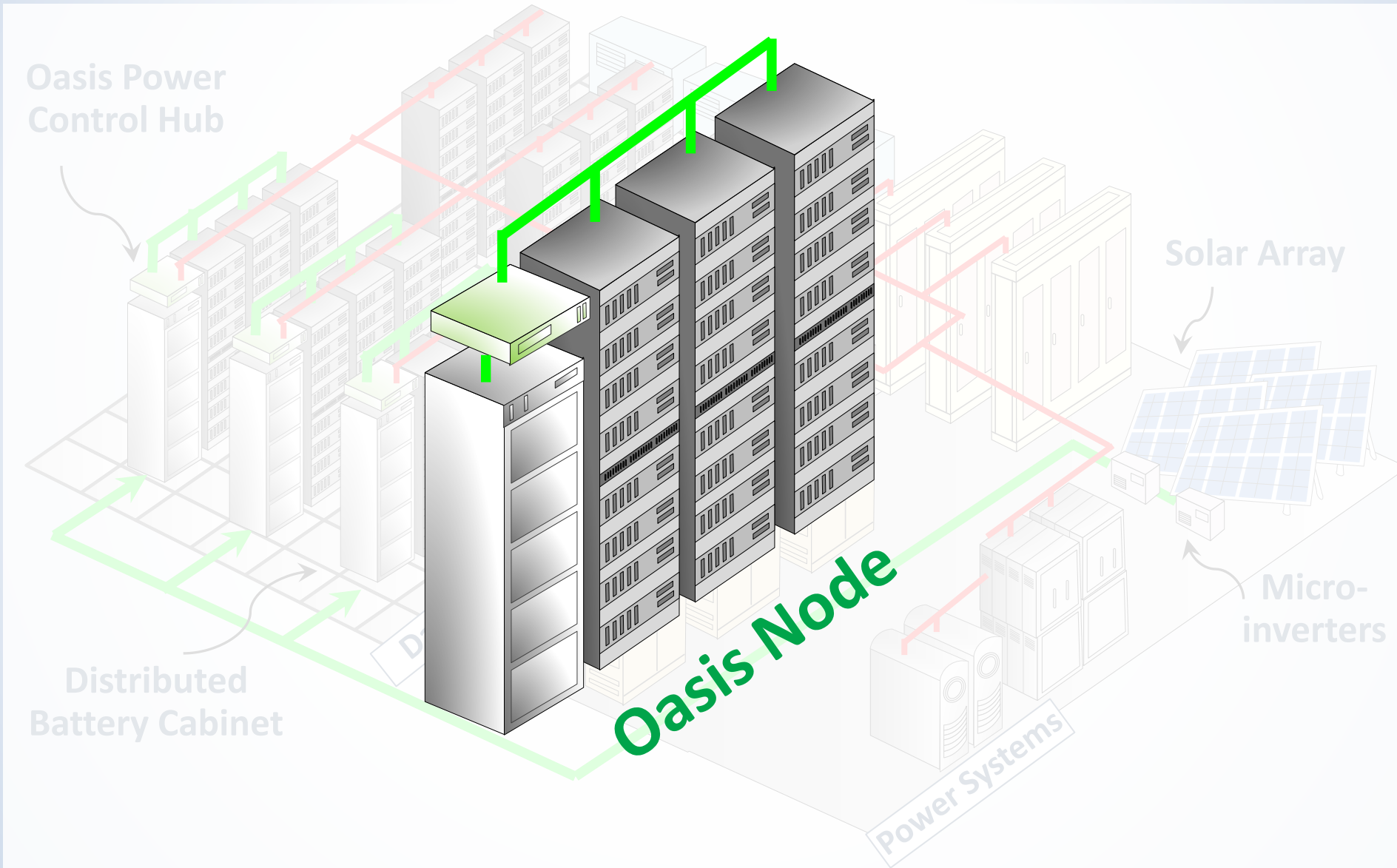
1. Carbon Footprint

Hardware/Equipment Level

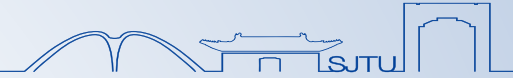
Unconventional power provisioning and energy storage strategies

We need a cross-layer optimization approach

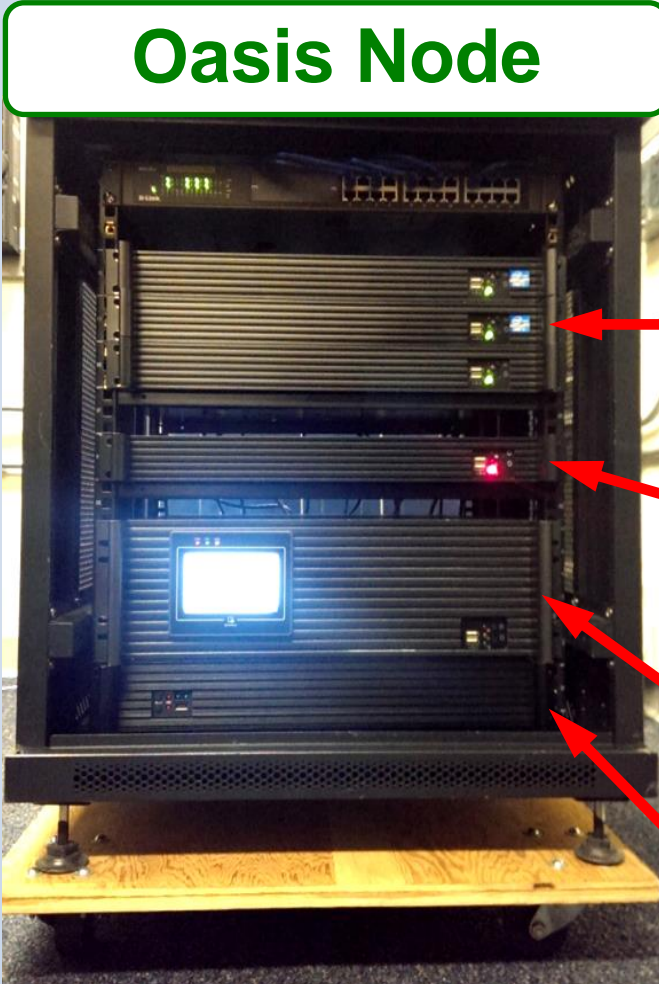
OASIS: A Modular Green Data Center



OASIS: A Modular Green Data Center



Oasis Node



Solar Modules

- Grape Solar 1.6 KW PV panels

Server Nodes

- AMD low-power node cluster

Power Mgmt. Agent

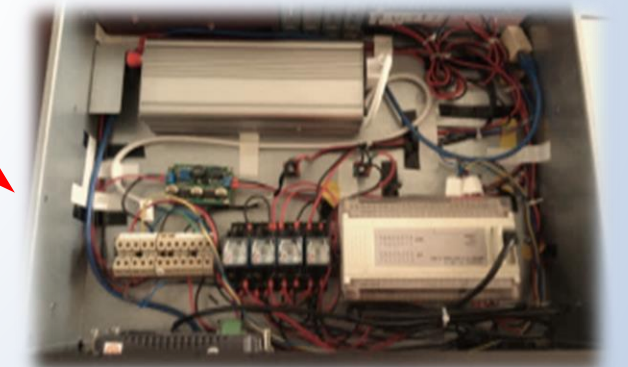
- AMD low power node

Power Ctrl. Hub

- PLC + HMI + Inverter ...

Battery Chassis

- Nine 2Ah lead acid batteries



Go Green-1: Our Work at the Hardware/Equipment Level

Background & Problem

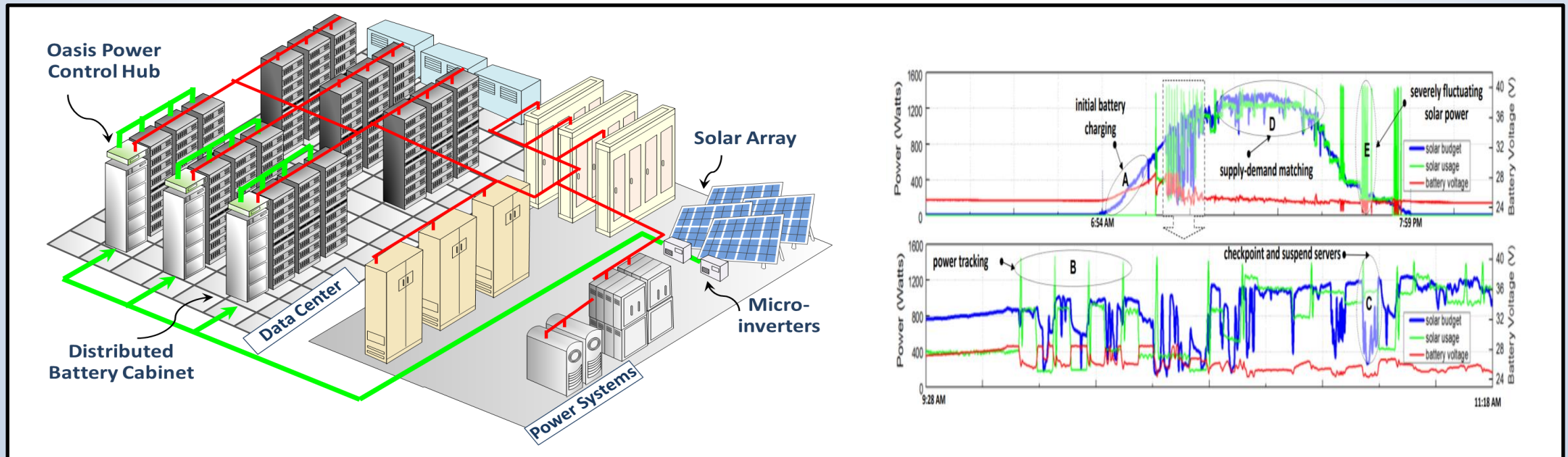
Edge computing data center cannot handle time-varying renewable power supply

idea

Allowing servers to adapt to renewable power

novelty

One of the first green edge data center prototype



Go Green-2: Our Work at the Architecture/System Level

Background & Problem

Data center incurs high load power peaks which is costly and less sustainable

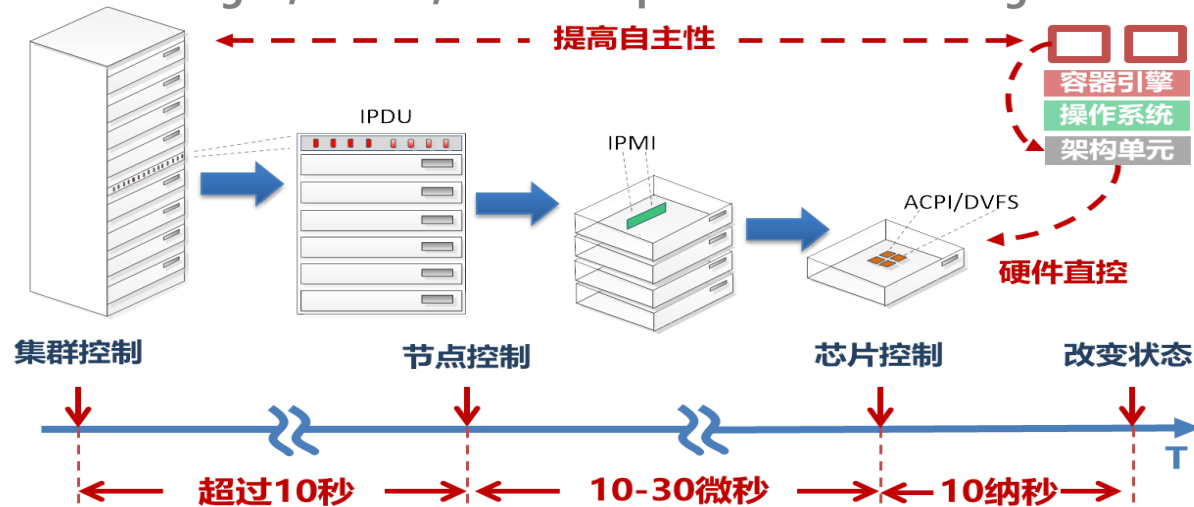
idea

Re-configure data center power control hierarchy

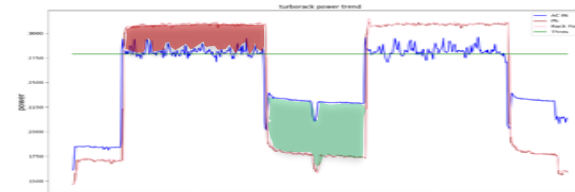
novelty

A super-fast data center power capping strategy

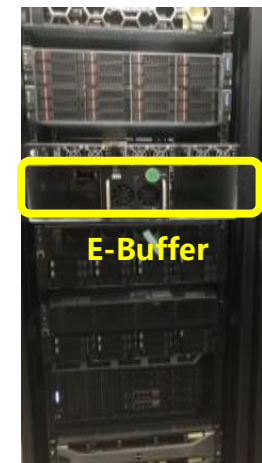
Agile, Native, and Transparent Power Management



```
def power_preprocess(power_trace, threshold):  
    power_chunk = dict()  
    total_num = len(power_trace)  
    indexes = power_trace[power_trace.power <= threshold].index.tolist()  
    i = 0  
    for index in indexes:  
        while i < index:  
            ts = power_trace[i].ts  
            if i+10 >= index:  
                power = power_trace[i:index-1]  
                sum_power = power.power.sum()  
                power_chunk[ts] = sum_power  
                power_chunk[power_trace[index].ts] = power_trace[index].power  
                i = i+10  
            break
```



Peak Power Tracking



Prototype

Go Green-3: Our Work at the Application/Service Level

Background & Problem

Prior graph computing framework cannot efficiently utilize unified memory

idea

Re-design data structure to reduce overhead

novelty

The first UM-aware graph computing framework

Graph Data

Prepare

Update

Generate

Processing

```
1 void Kernel(){
2   for vtx in frontier{ // Assign each active vertex
3     to one warp
4     for edge in vtx.edgeSet{ //Threads in the same
5       warp process edges in parallel
6       Update(); // Update labels
7       Generate(); // Enqueue vertices based on
8       criteria
9   }}
10 bool CheckConverge(){
11   if (frontier.size()==0) return true;
```

```
9   return false;}
10 void Main(){
11   Init();
12   SetMemPolicy(); //Set adaptive UM policy for UM
13   prefetching and hints
14   while(!CheckConverge()){
15     Prepare();
16     Kernel();
17     frontier.getNew(); //BDF gets the new frontier
18     and reset the bitmap.
19   }}
```



- ➡ 1 Sustainable Computing: An Introduction

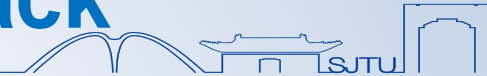
- ➡ 2 Three Aspects of Sustainable Computing

- ➡ 3 **Challenges of Green Cloud Computing**

- ➡ 4 Summary and Discussions



We Need to Better Understand the Cloud Stack



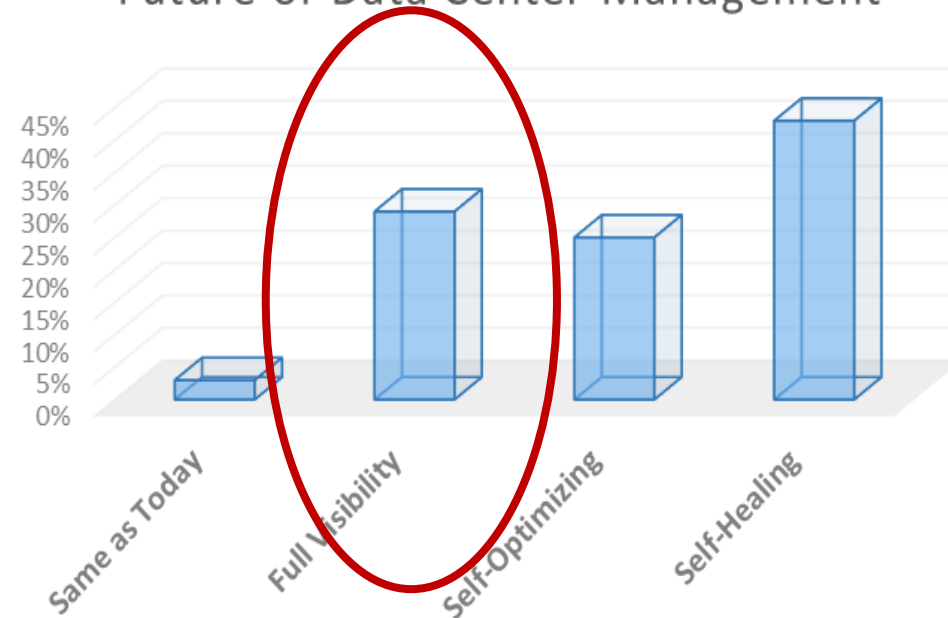
Green cloud computing demands collaborative design

We need to know our infrastructure

- 《Data Center 2025: Exploring the Possibilities》



Future of Data Center Management



Key Challenges of Managing a Complex Data Center



How to Handle the Complexity?

Design Challenges

1

Module-Level Heterogeneity

not all modules are equal

“WHAT”

2

Cross-Layer Coordination

there are semantic gaps

“WHICH”

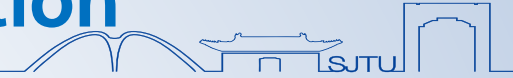
3

Spatial/Temporal Variability

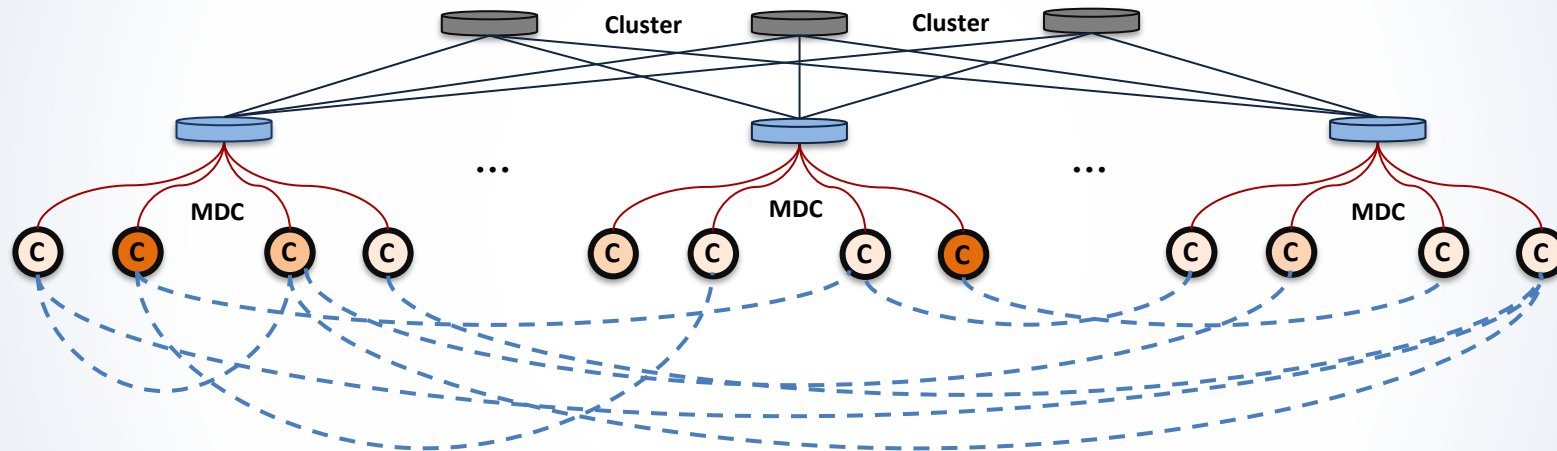
resources keep changing

“HOW”

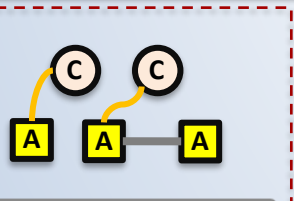
Future Direction-1: Graph-Based Hardware Abstraction



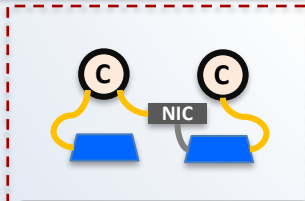
We need an abstraction/representation of the underlying resources



Hidden Relationship

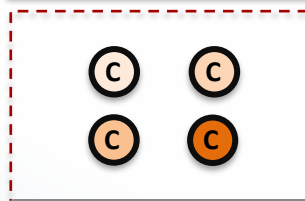


Interconnect

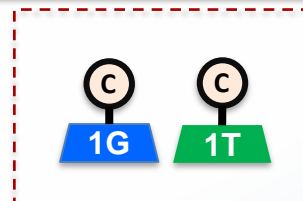


Mem Access

Runtime Properties

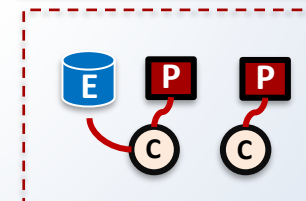


Core Variation

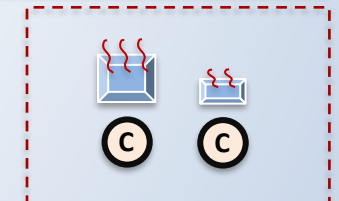


Capacity Issue

Indirect Interaction

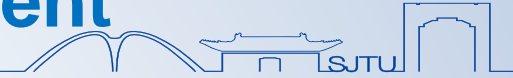


Power budget

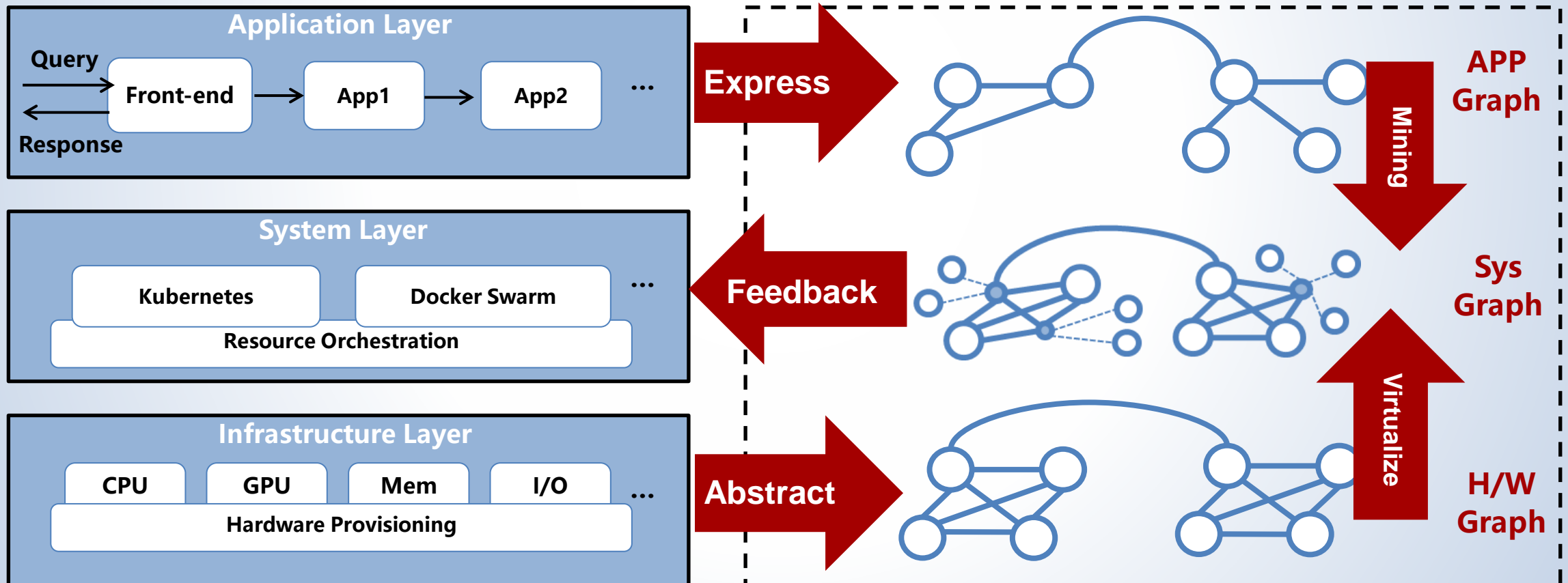


Thermal Issue

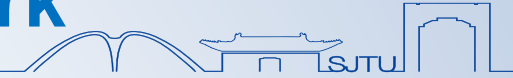
Future Direction-2: Data-Driven Resource Management



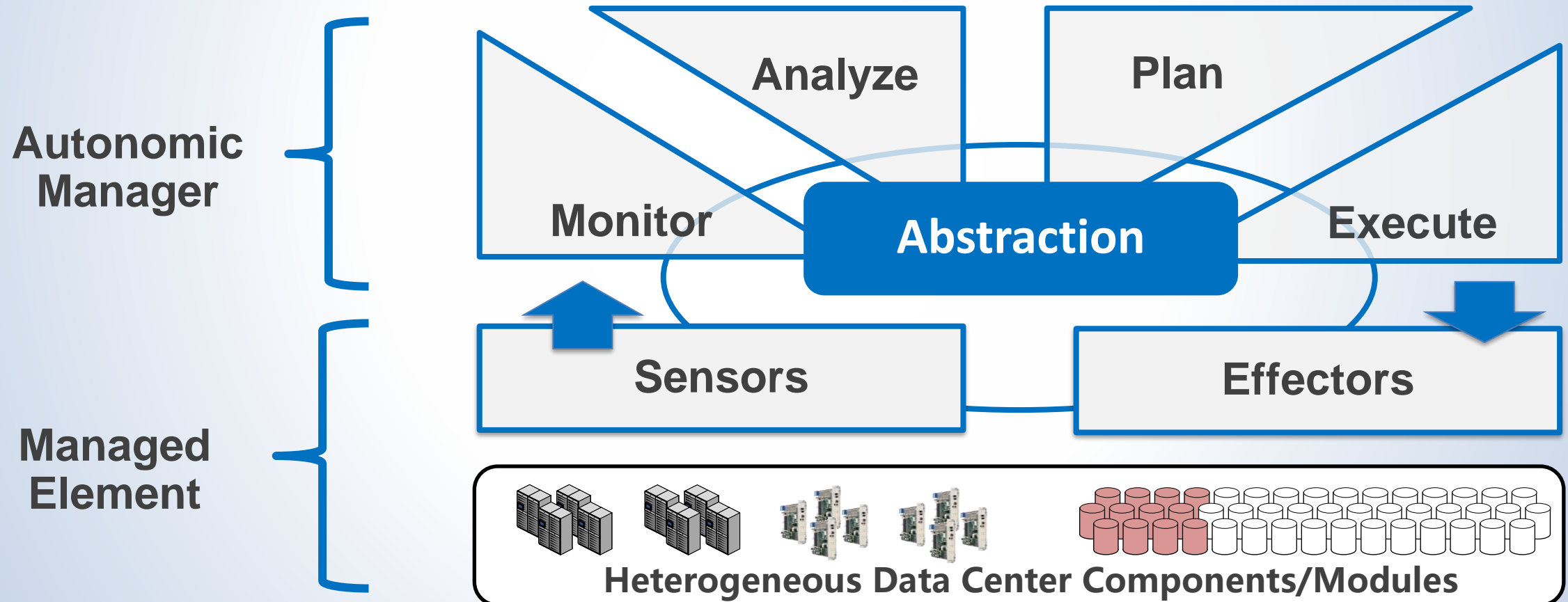
We need a data-driven resource management across the full stack



Future Direction-3. Self-Managing Control Framework



We need to enable the system to manage itself in the long run



- ➡ 1 Sustainable Computing: An Introduction

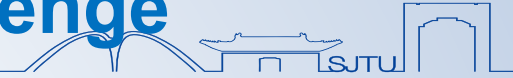
- ➡ 2 Three Aspects of Sustainable Computing

- ➡ 3 Challenges of Green Cloud Computing

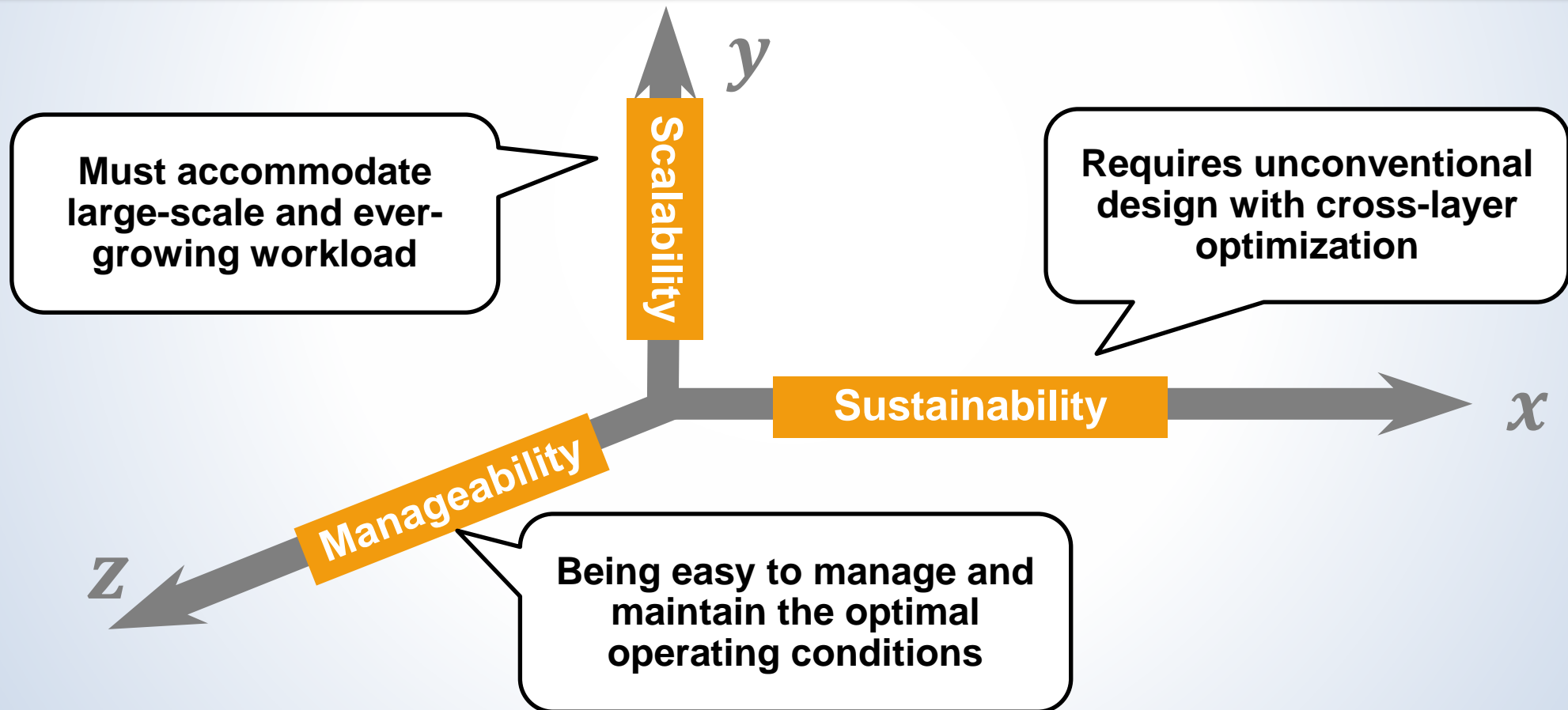
- ➡ 4 **Summary and Discussions**



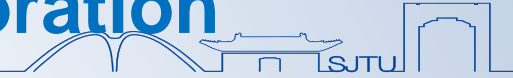
The “Sustainability-Scalability-Manageability” Challenge



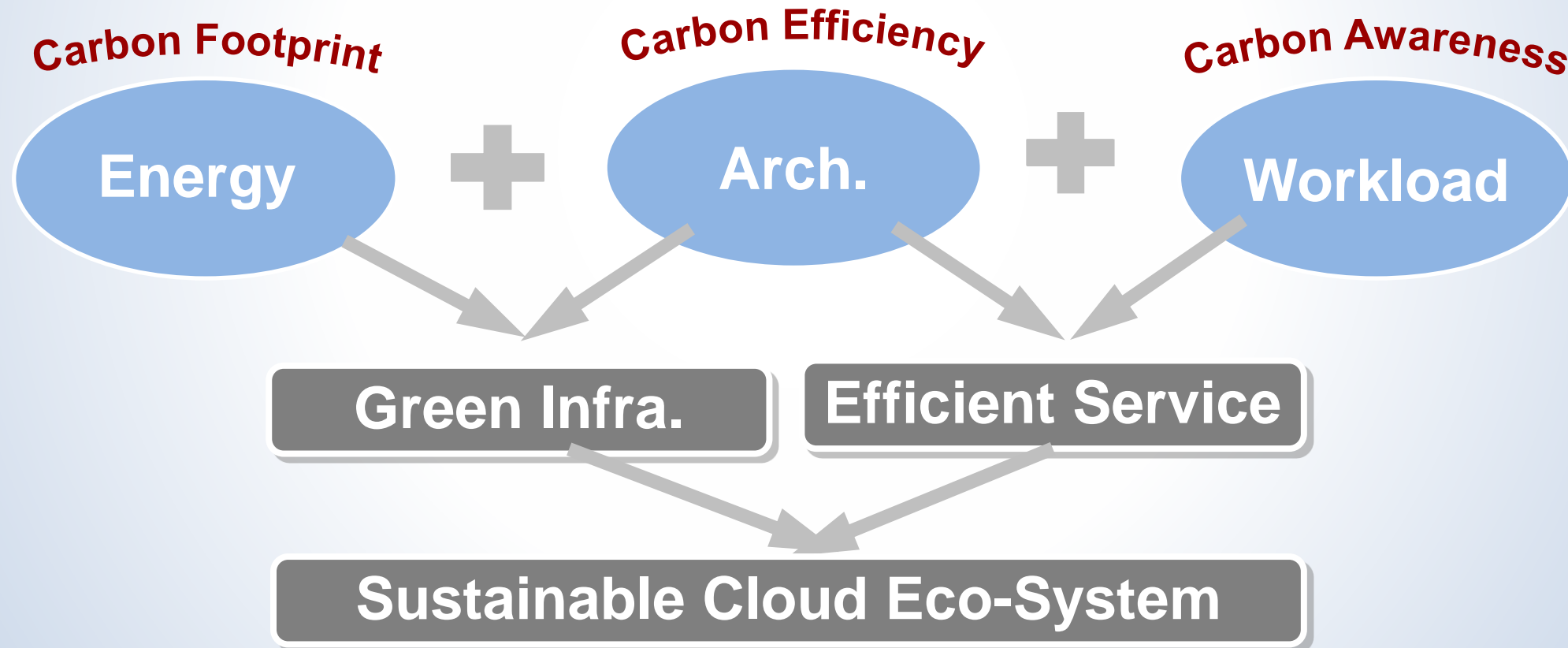
It can be very challenging to build a highly scalable and sustainable computing system that is also easy to manage



Requires “Energy-Architecture-Workload” Co-Exploration



The Cloud should be designed for sustainability at three layers, combining the optimization of energy, architecture, and workload



Thanks!

Contact: CHAOL@SJTU.EDU.CN