

# Carbon-Aware Global Routing In Path-Aware Networks

Jonghoon Kwon  
ETH Zürich



# Why CO<sub>2</sub>-Awareness?

## EU commission chief asks G20 to join global carbon pricing

Reuters

September 9, 2023 11:43 AM GMT+2 · Updated 5 days ago



## Carbon accounting is going broad and granular. Are we ready?

by Ralf W. Seifert, Richard Markoff, Alexander Schmidt  
Published 11 April 2023 in Supply chain · 8 min read



Europe is about to implement a major change in the reporting standards and requirements for carbon as part of the European Green Deal. These changes will require more companies to account for their carbon footprints over a broader scope and in greater granular detail. The authors explore the implications of this major policy shift.



VOXEU COLUMN CLIMATE CHANGE ENVIRONMENT EU POLICIES

## The economic effects of carbon pricing

Diego Känzig, Maximilian Konradt / 12 Aug 2023

Carbon pricing policies are critical tools to mitigate the effects of climate change. This column examines the impact of European carbon pricing policies on the economy, contrasting the common carbon market with national carbon taxes. The authors find that



Ursula von der Leyen gestures during a joint press statement with Philippine President Ferdinand Marcos Jr. at the Malacañang Presidential Palace in Manila, Philippines, July 31, 2023. Aaron Favila/POOL via Getty Images

Reuters) - The European Commission president asked G20 leaders on Tuesday to set up global carbon pricing.

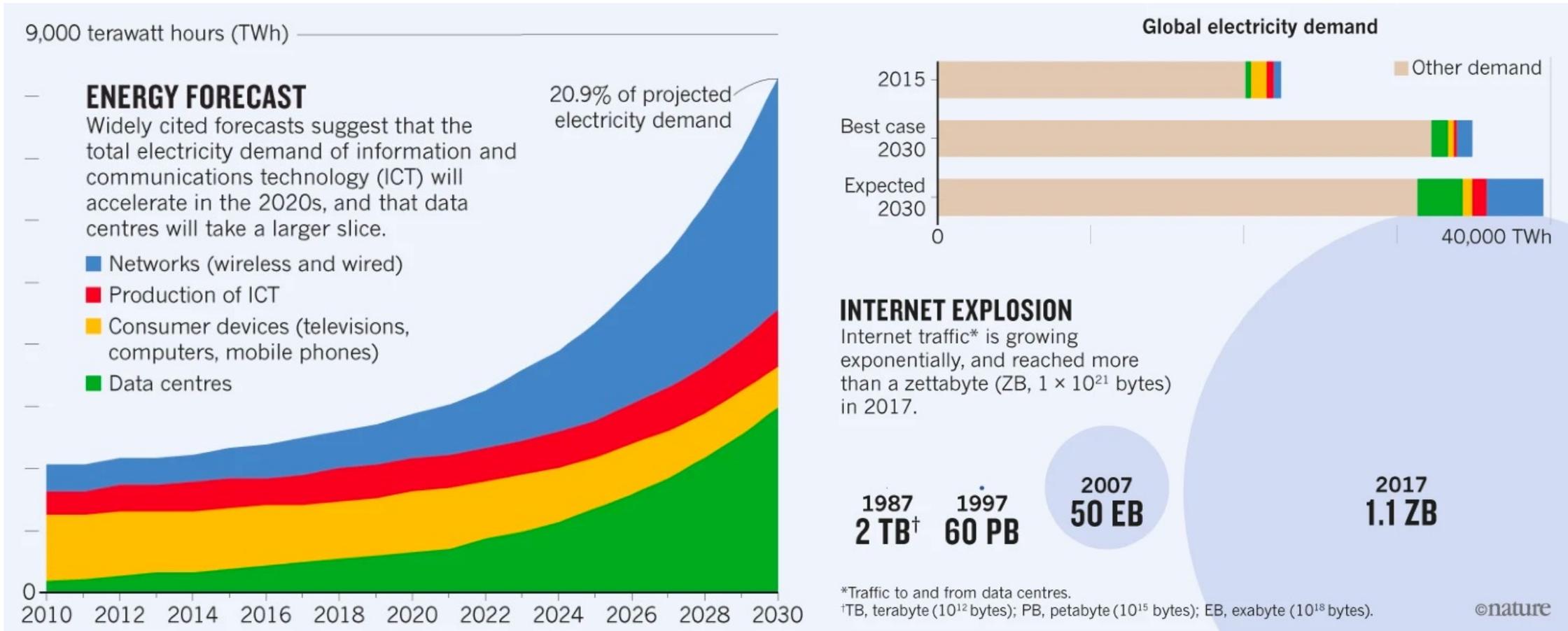
...ing a price on carbon to help meet their climate goals in the form of a tax ... trading (ETS), or cap-and-trade, system.

An email with attachment  
is account for **50g** of CO<sub>2</sub>

<source: ictfootprint.eu>



# ICT Carbon Footprint



<Source: nature.com>

# Is It Possible in Today's Internet?

ISPs select inter-domain paths



Endpoints have no control over paths



No means of carbon transparency

# Carbon-Aware Networking?

- Path transparency





# Carbon-Aware Networking?

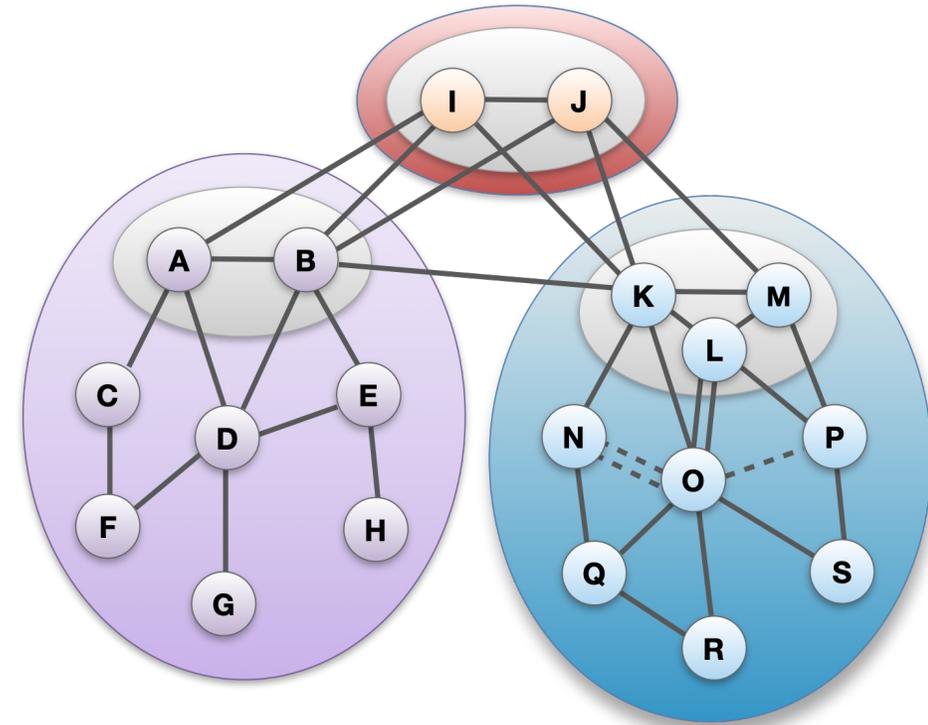
- Path transparency
- Carbon intensity estimation
- Endpoint path control



# Already Possible with The Future Internet Architecture



- Path-based Network Architecture



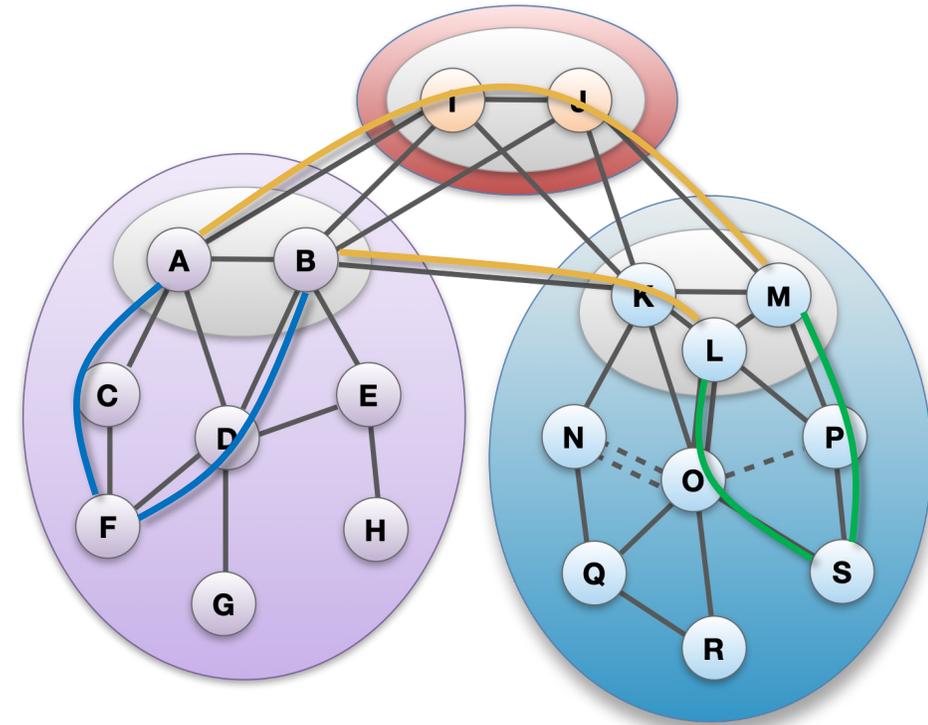
# Already Possible with The Future Internet Architecture



- Path-based Network Architecture

## Control Plane - Routing

- ❖ **Constructs** and **Disseminates**  
Path Segments



# Already Possible with The Future Internet Architecture



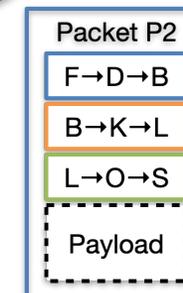
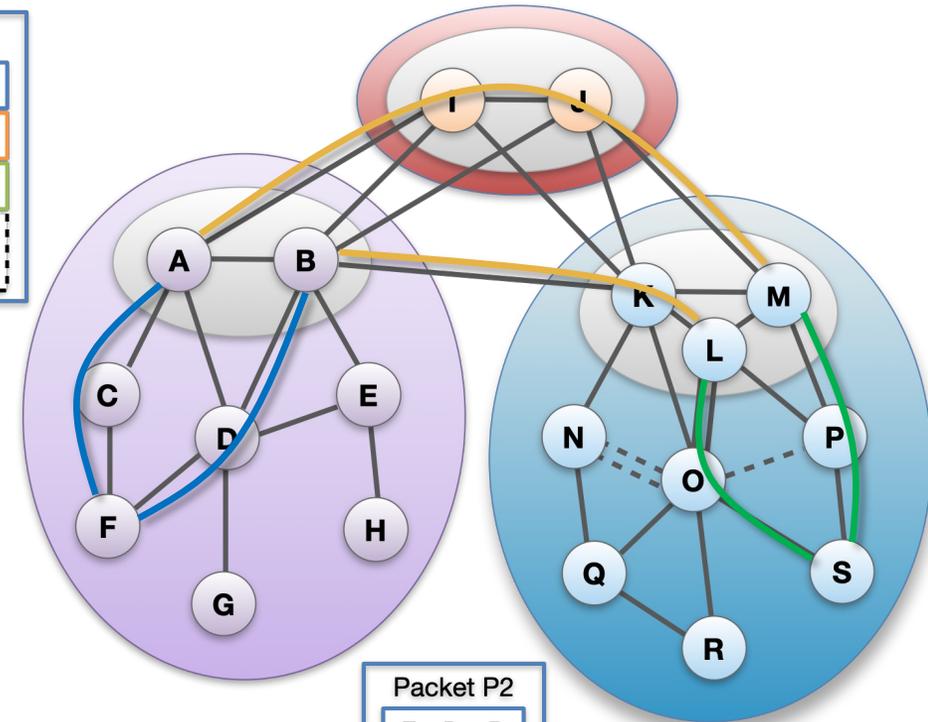
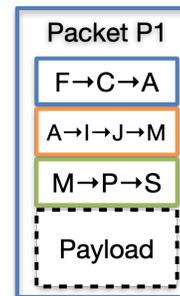
- Path-based Network Architecture

## Control Plane - Routing

- ❖ **Constructs** and **Disseminates** Path Segments

## Data Plane - Packet forwarding

- ❖ **Combine** Path Segments to Path
- ❖ Packets contain Path
- ❖ Routers forward packets based on Path
- ▶ Simple routers, stateless operation



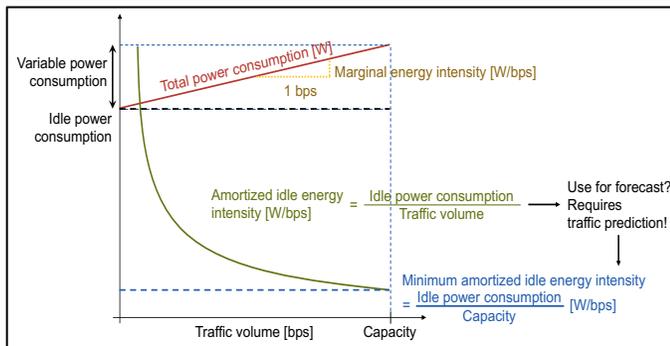
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- CIRo: Carbon-Aware Inter-Domain Routing based on Path-Aware Networking

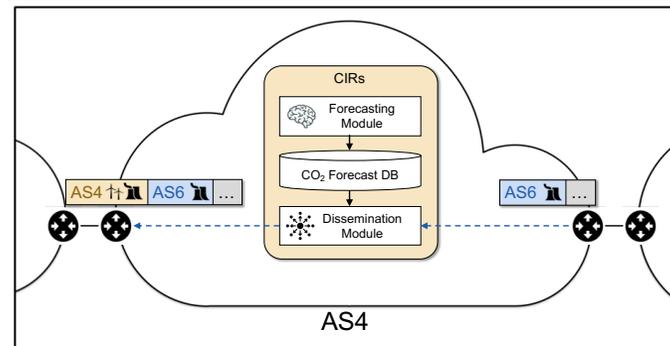
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Model for carbon intensity of Internet paths



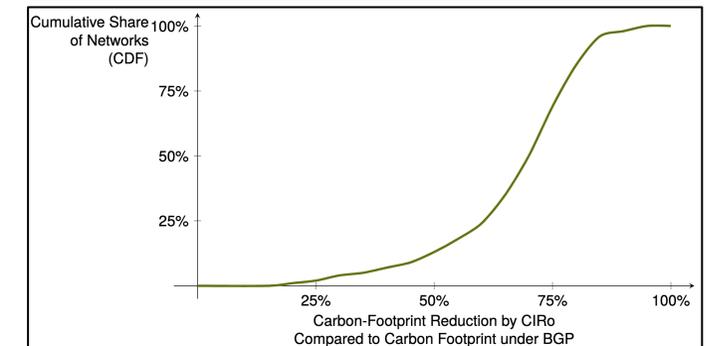
## Carbon-Information Dissemination

System for timely communication of forecasts



## Carbon-Footprint Impact Analysis

Simulation on data-backed large-scale topology



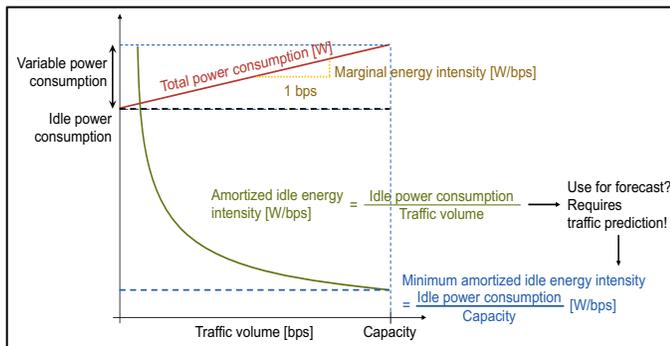
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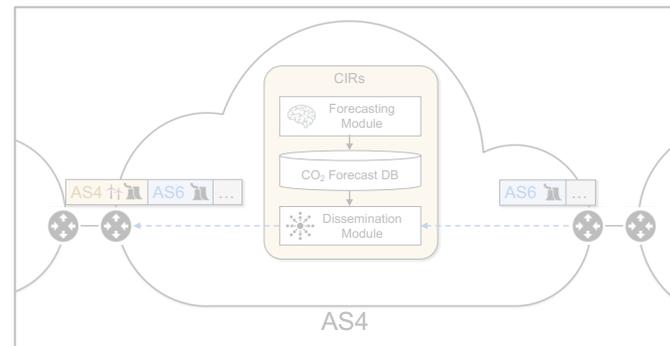
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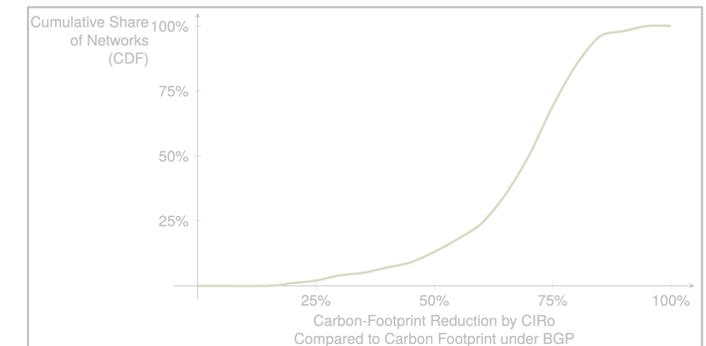
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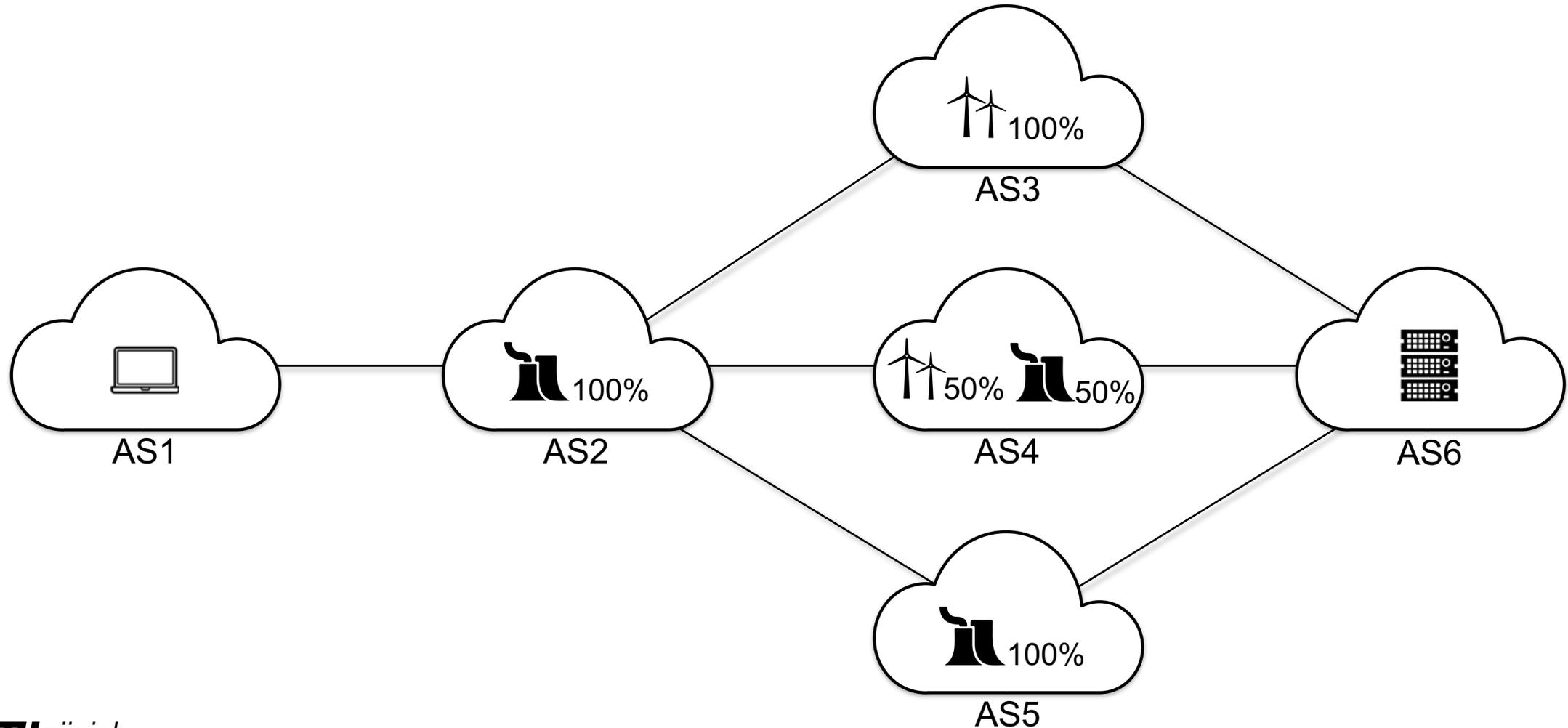


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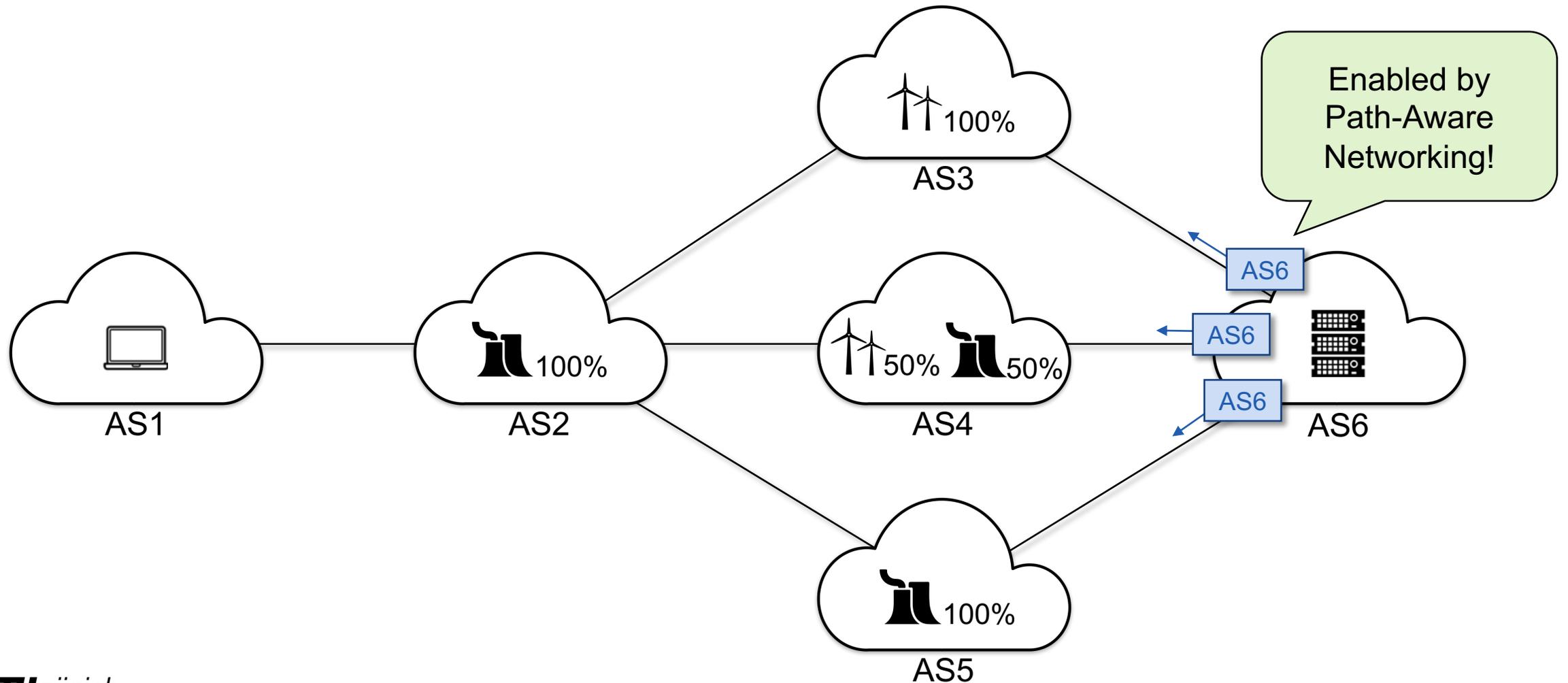
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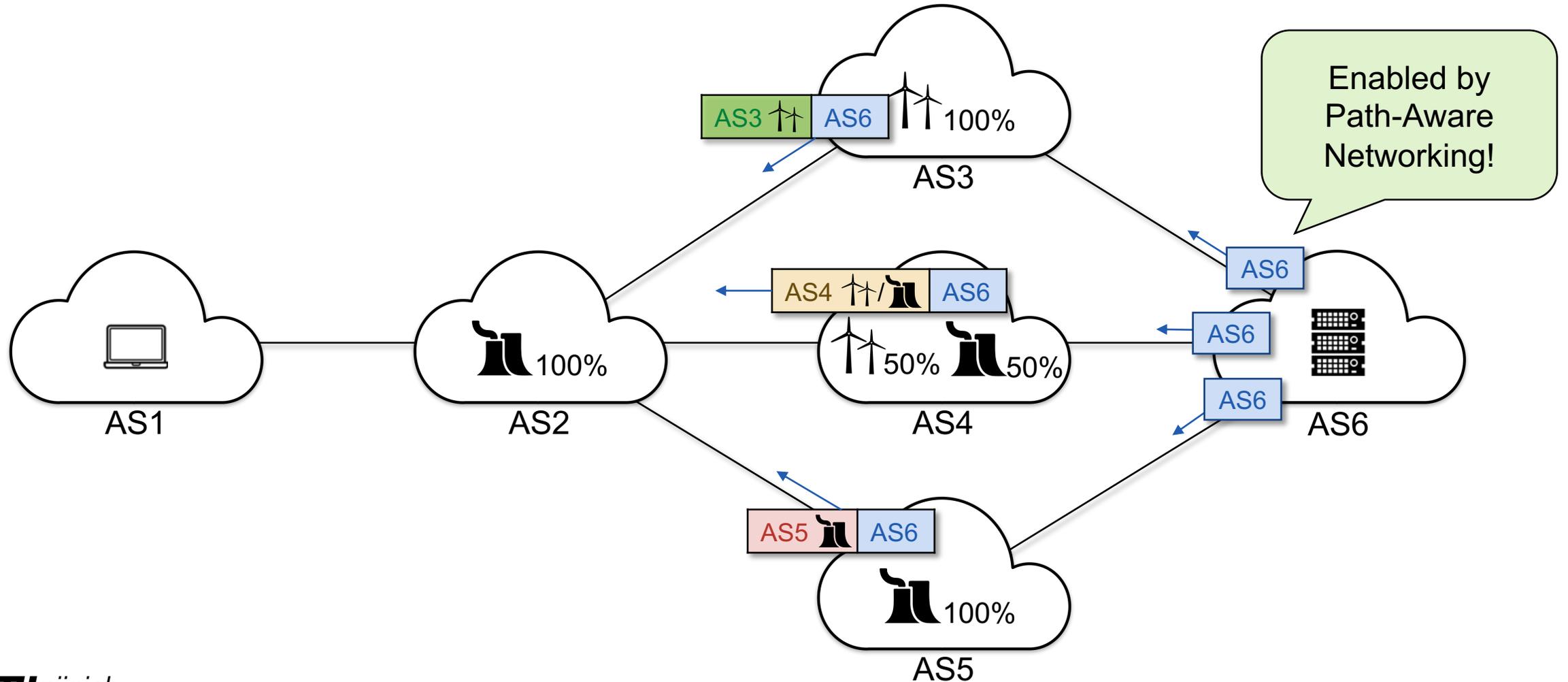
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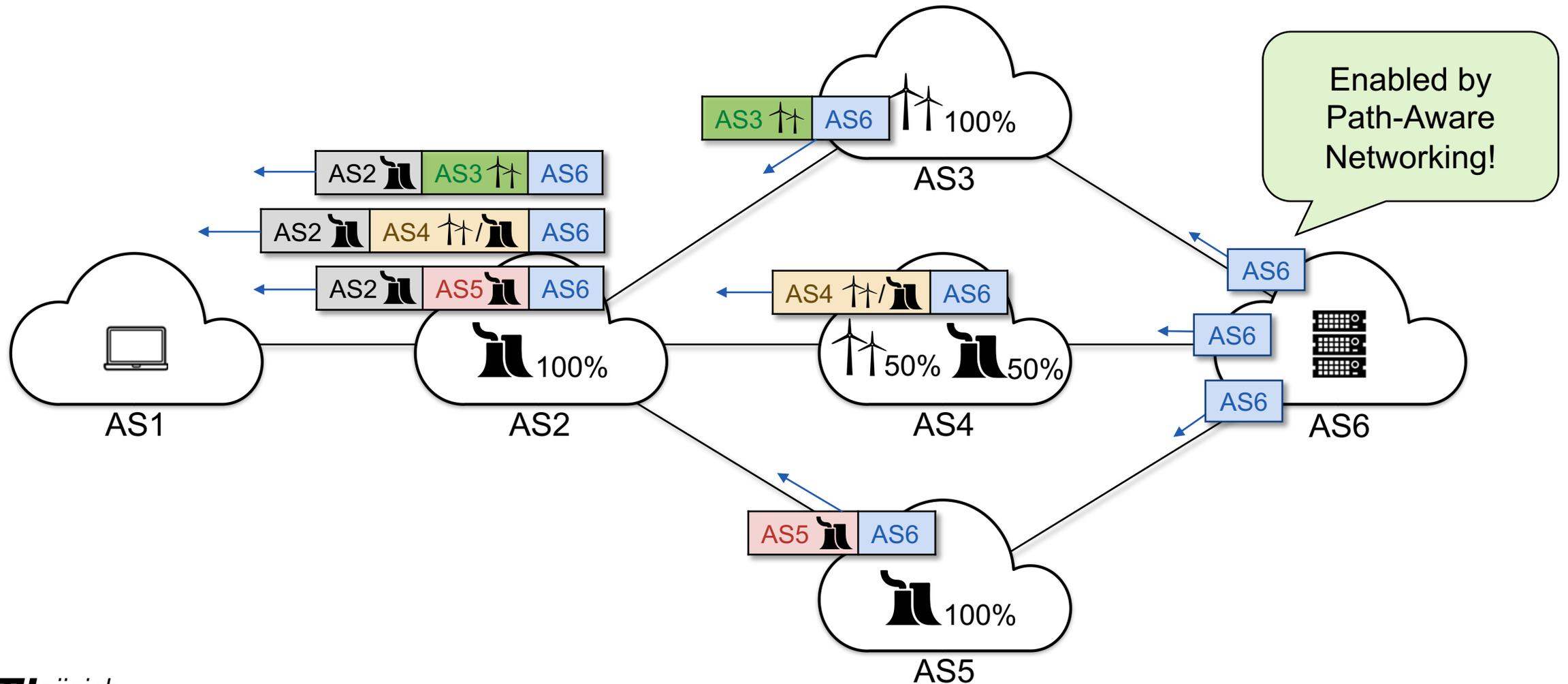
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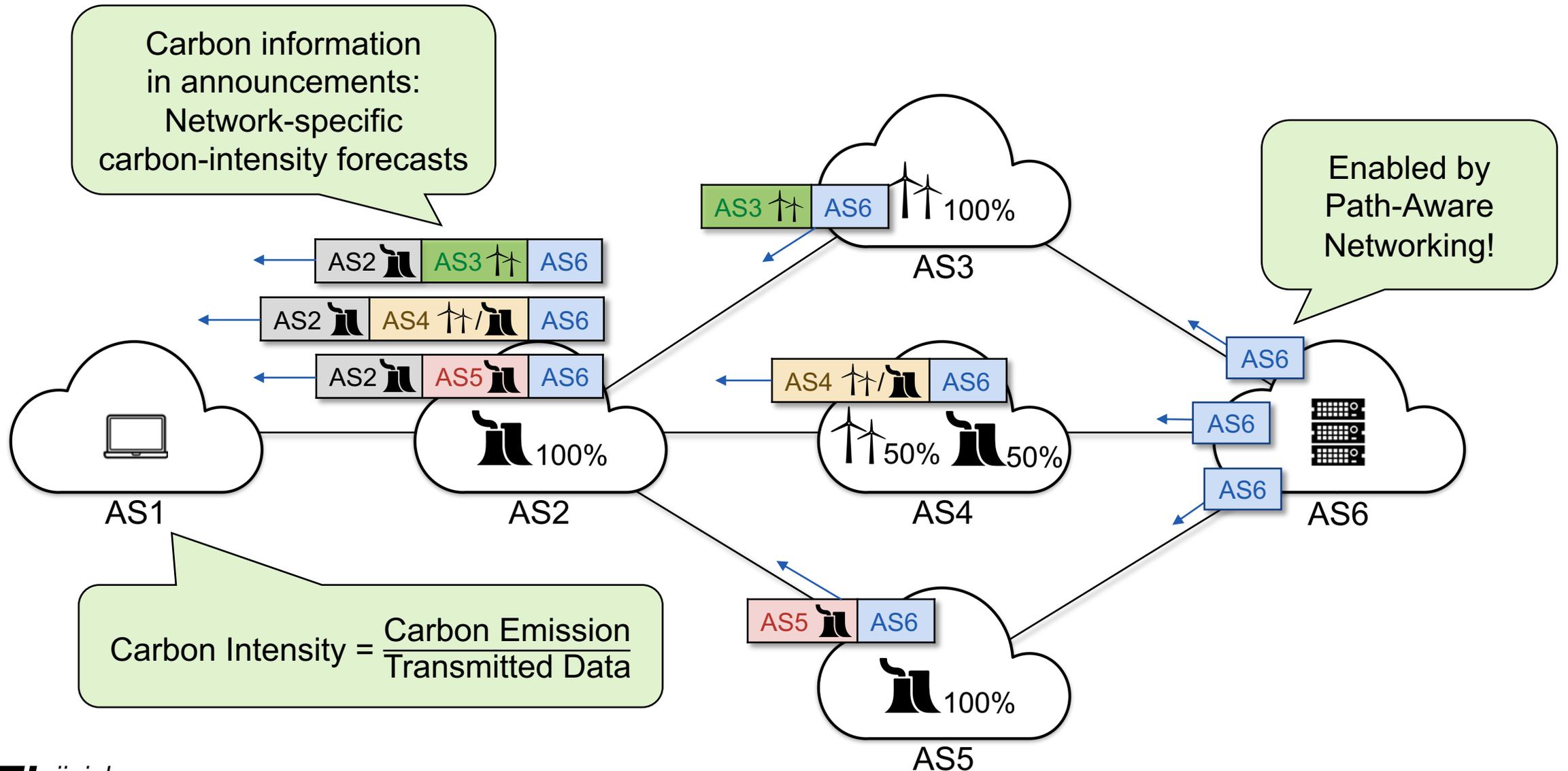
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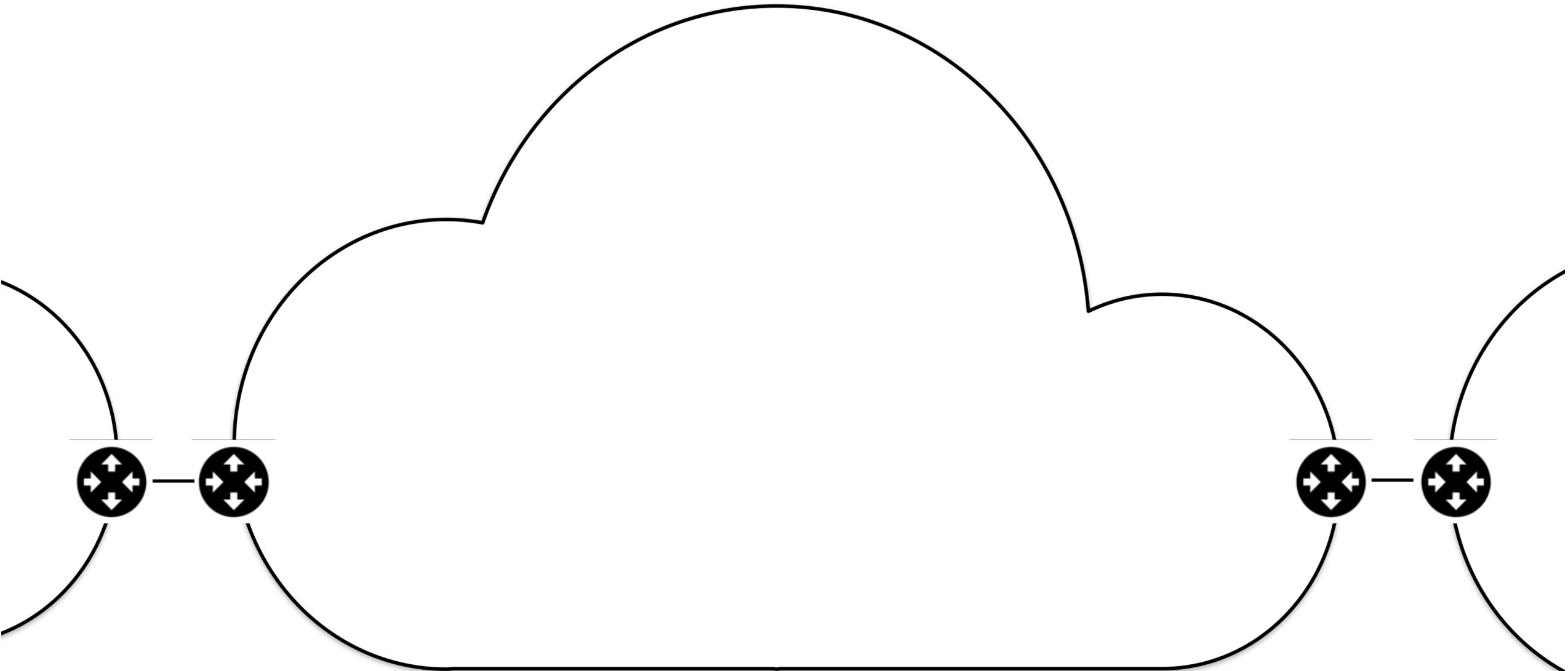
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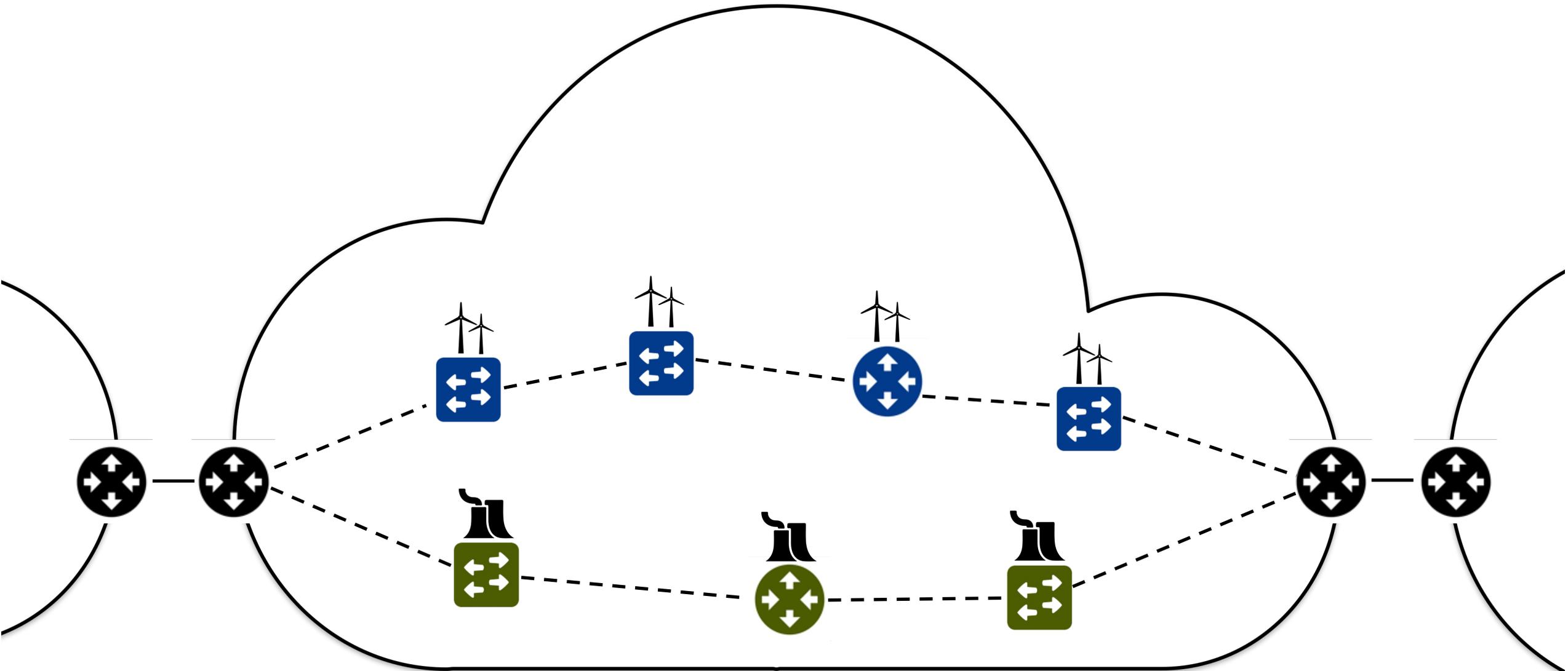
# Carbon Intensity Forecasting



# Network-Specific Carbon Intensity

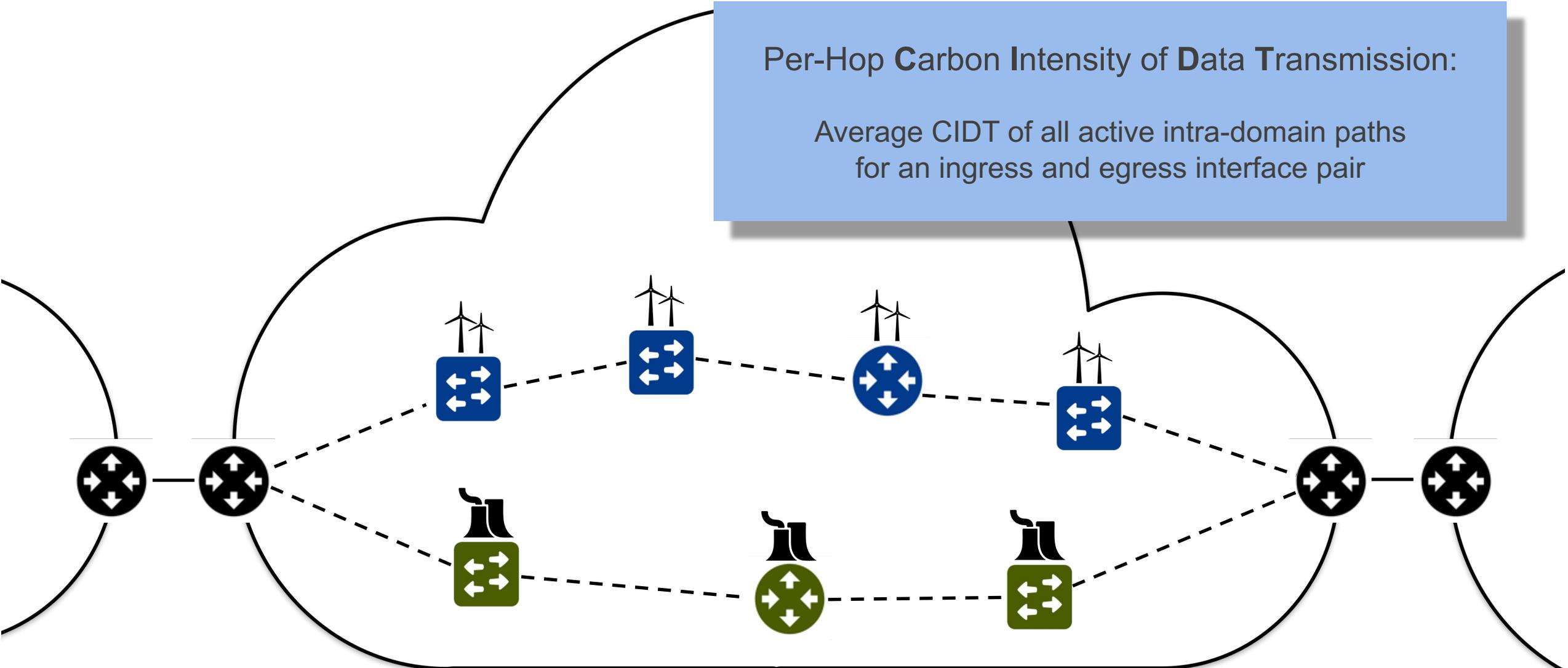


# Network-Specific Carbon Intensity



# Network-Specific Carbon Intensity

Per-Hop Carbon Intensity of Data Transmission:  
Average CIDT of all active intra-domain paths  
for an ingress and egress interface pair



# Device-Specific Carbon Intensity

- Carbon Intensity of Data Transmission =  $\frac{\text{Carbon Emission}}{\text{Transmitted Data}}$

# Device-Specific Carbon Intensity

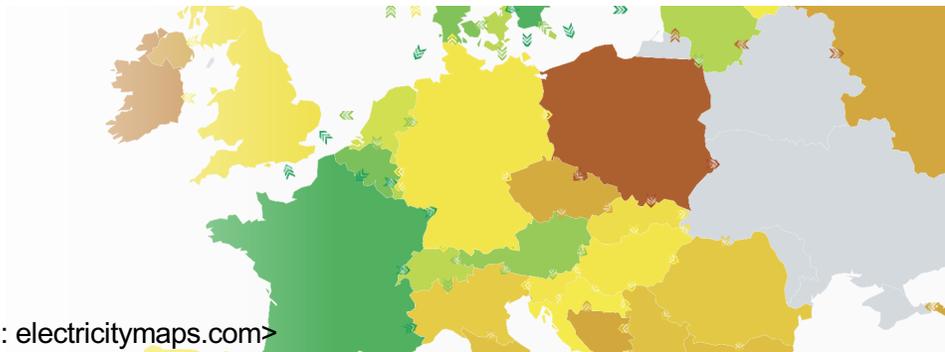
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## ① Carbon-Intensity of Electricity

Device Location ⊕ Electricity-Grid Forecast



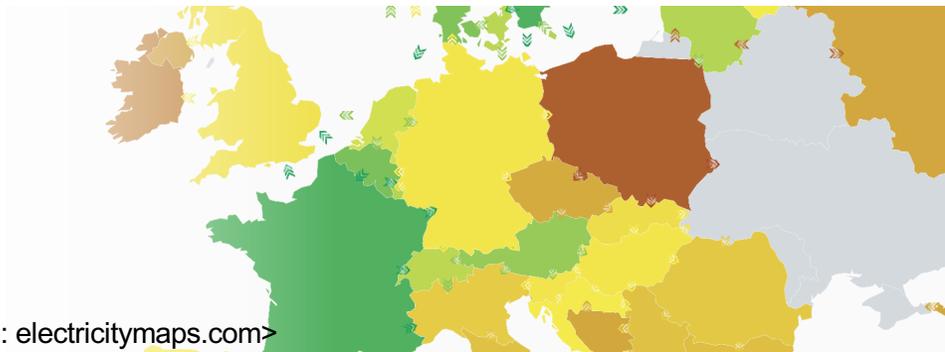
<source: electricitymaps.com>

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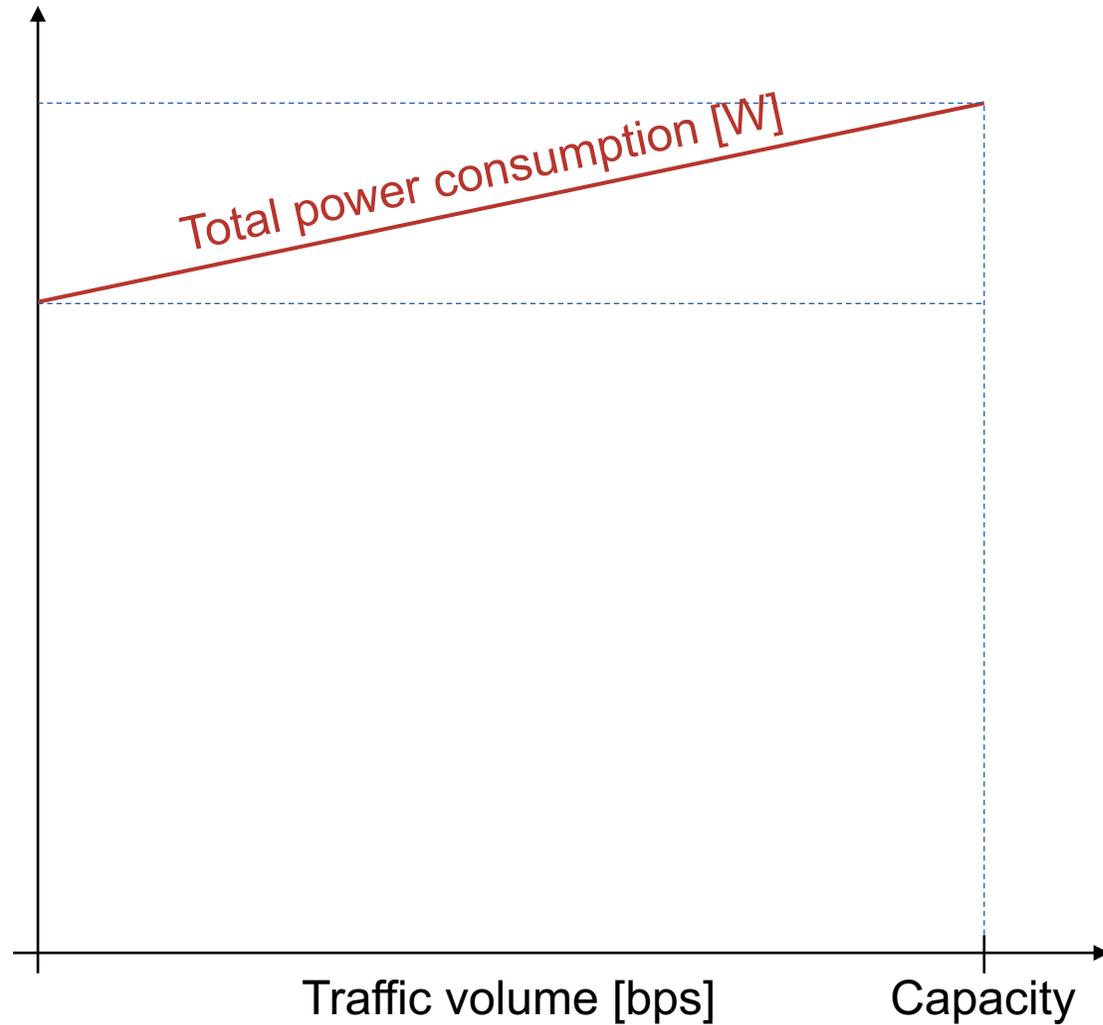
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## ② Energy-Intensity of Data Transmission

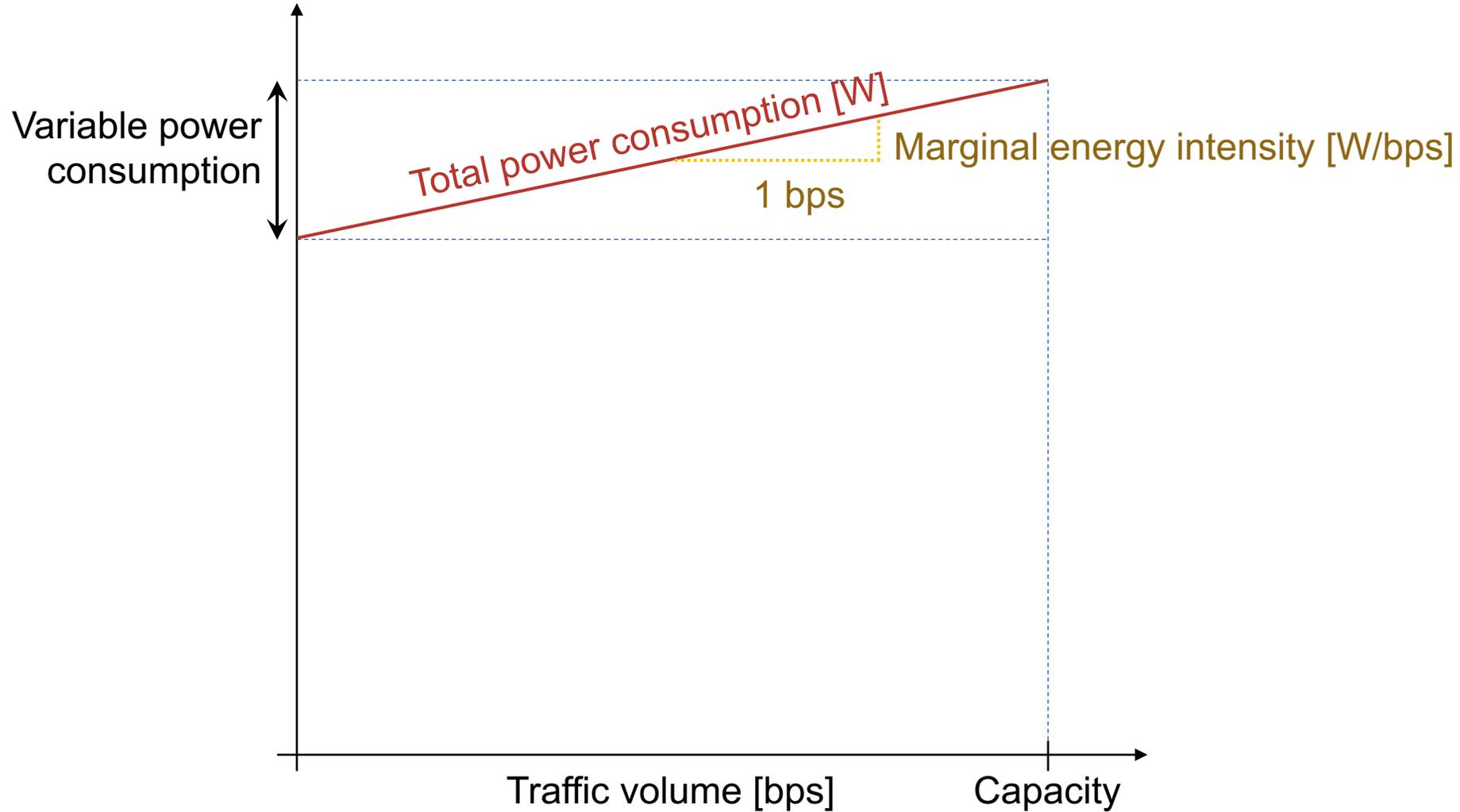
Device Power Profile

Mode	Current [mA]	Power Consumption [mW]		
		@ 1.8 V	@ 3.6 V	
Power Down	700 nA	< 1.26 uW	< 2.52 uW	
CPU Active	4.1	7.38	14.76	
Receiving	6	10.8	21.6	
Transmitting	14.5	26.1	52.2	
CPU Active + TX	18.6	33.48	66.96	

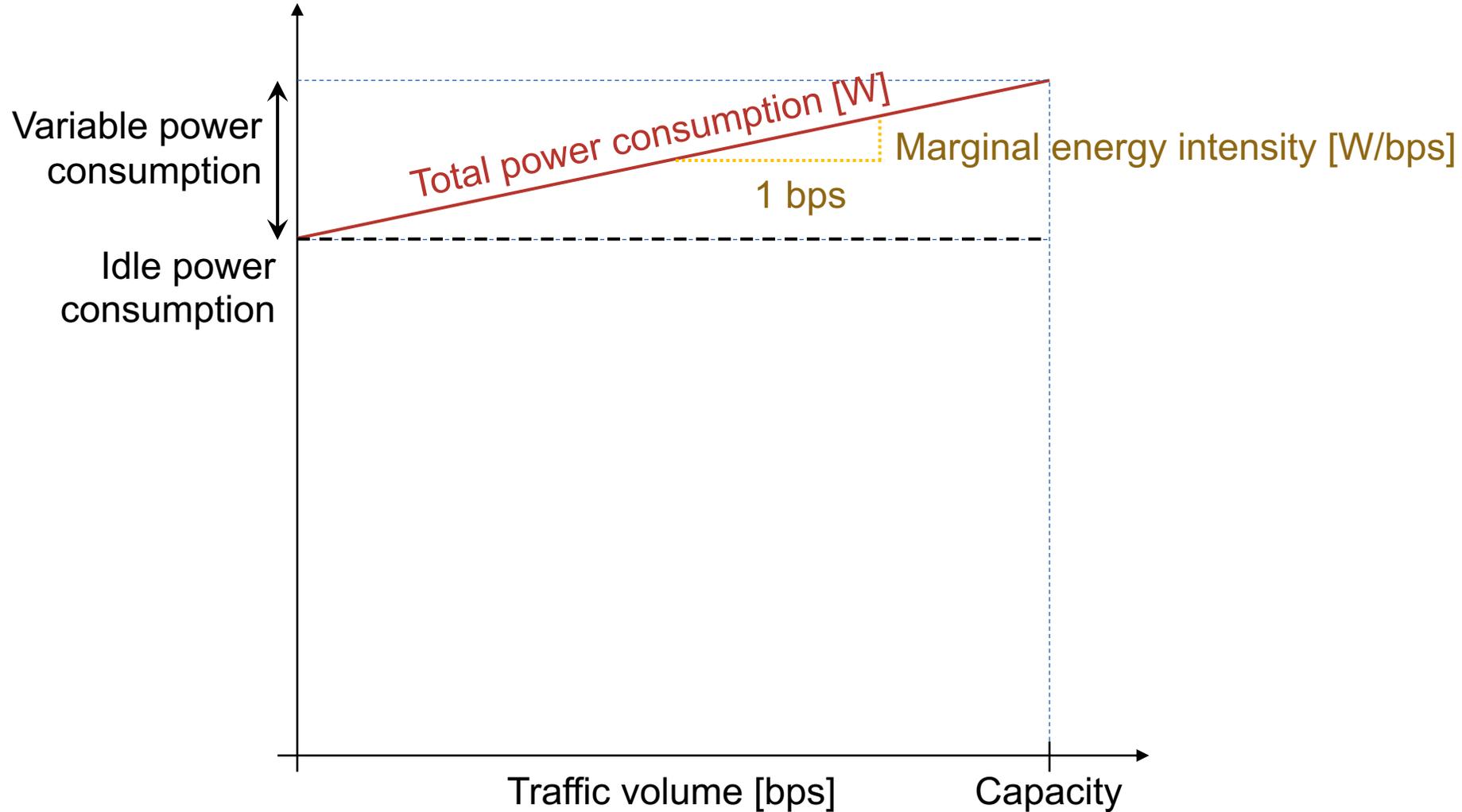
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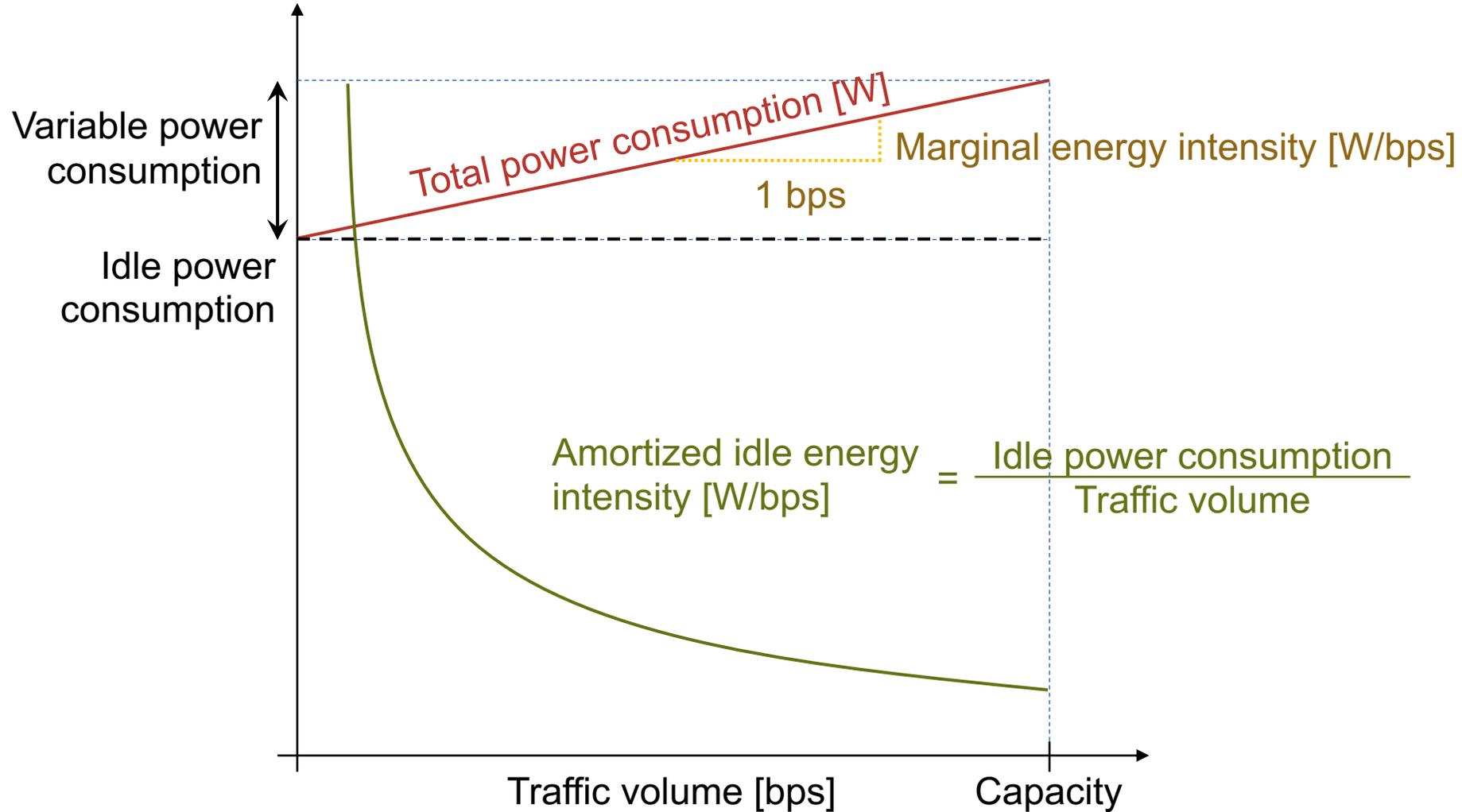
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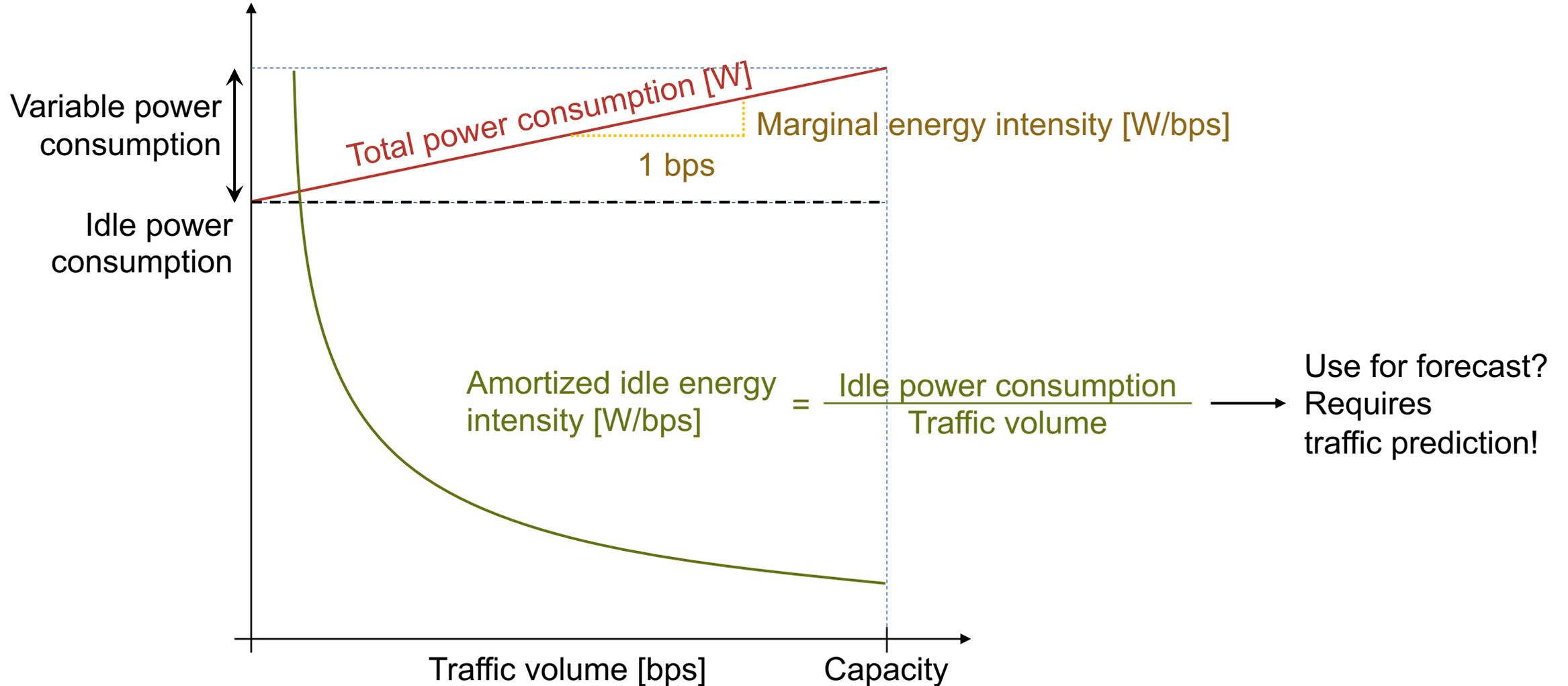
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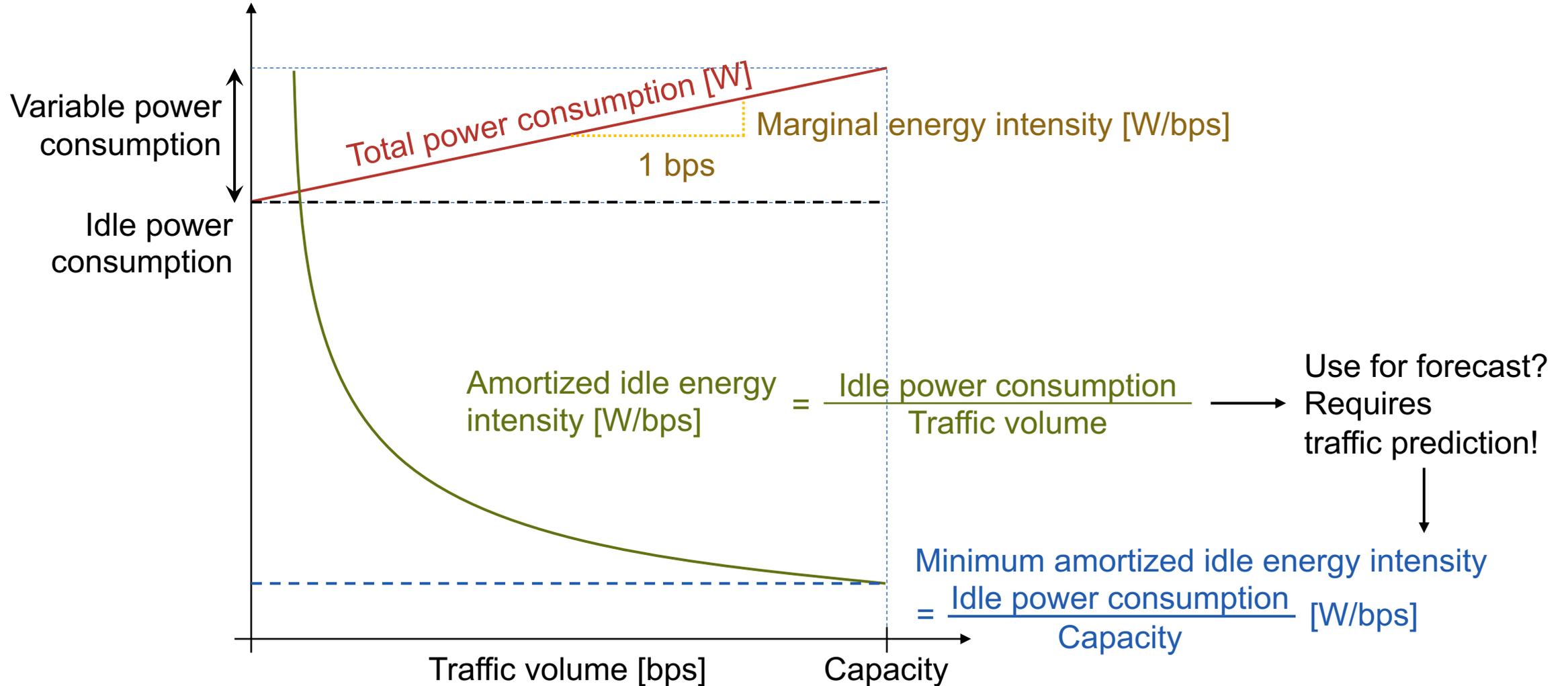
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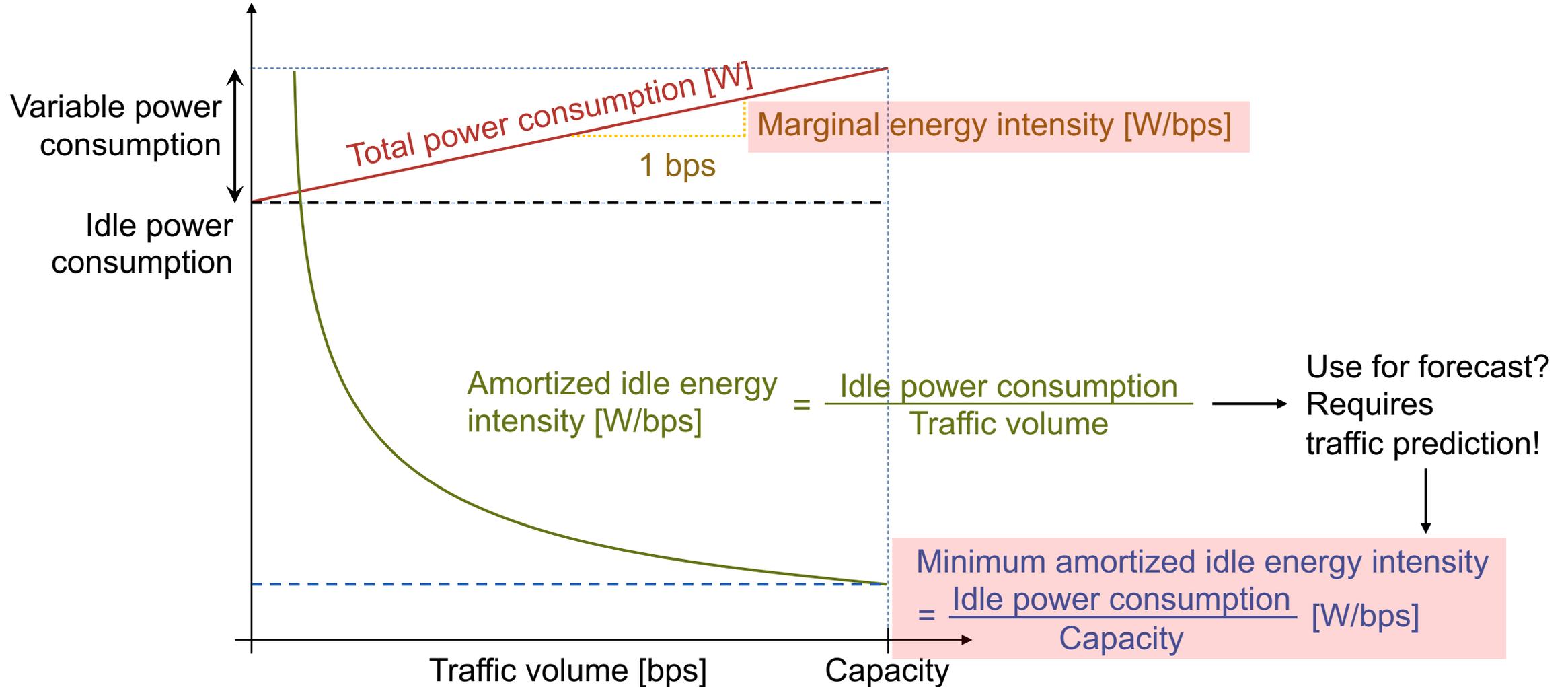
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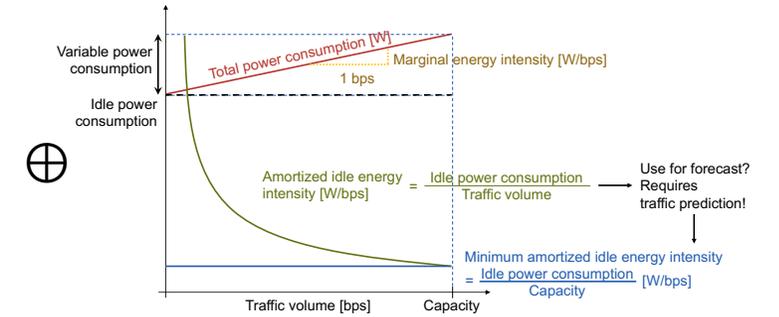
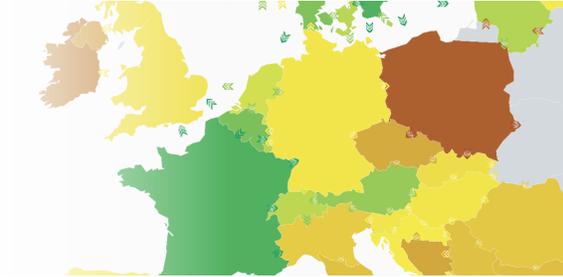


# Device Power Profile



# Carbon Intensity Forecasting: Summary

Carbon intensity of devices

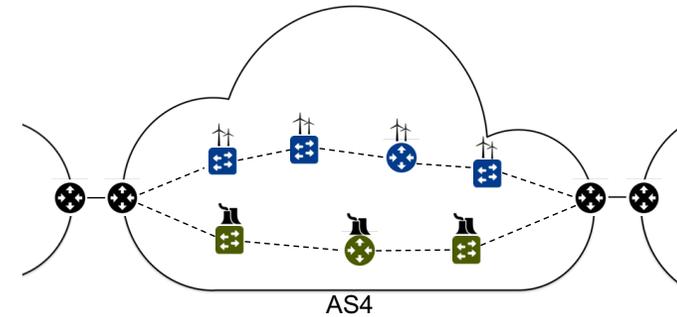
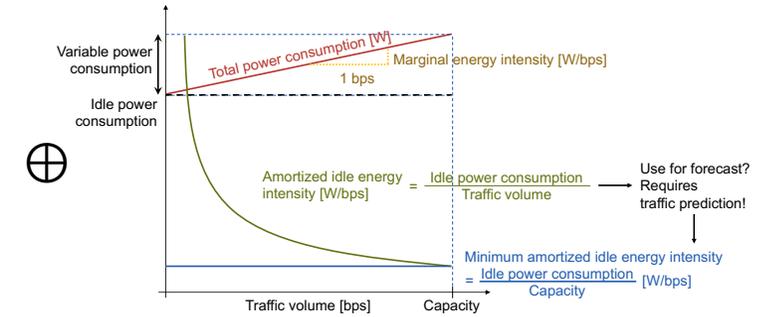
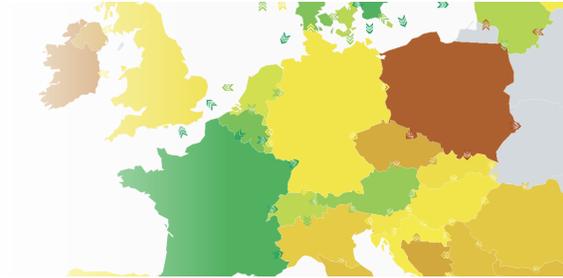


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Carbon intensity of devices



Carbon intensity of intra-network paths



# Carbon Intensity Forecasting: Summary

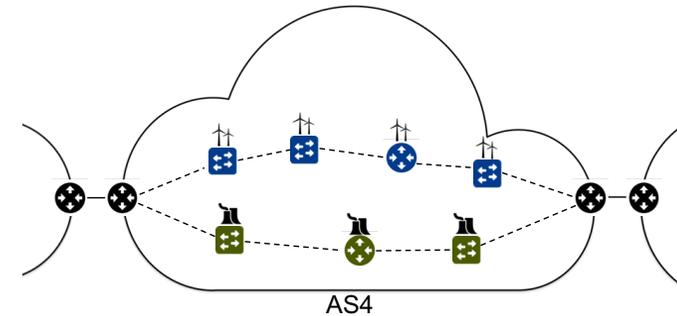
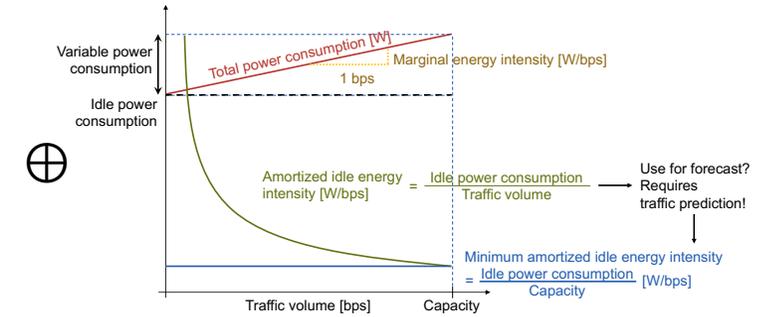
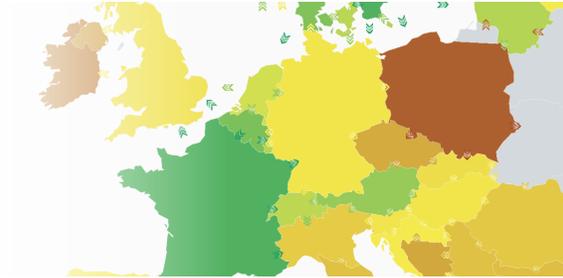
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Carbon intensity of intra-network paths



Carbon intensity of network with respect to interface pair



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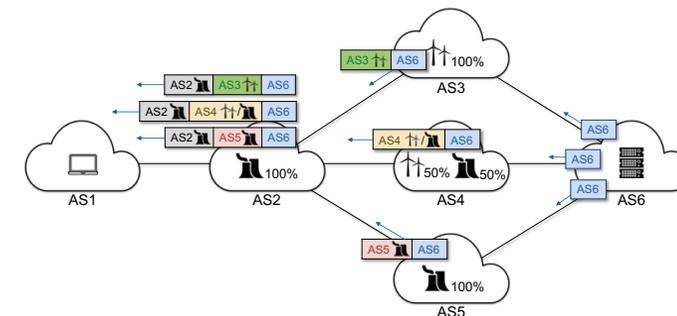
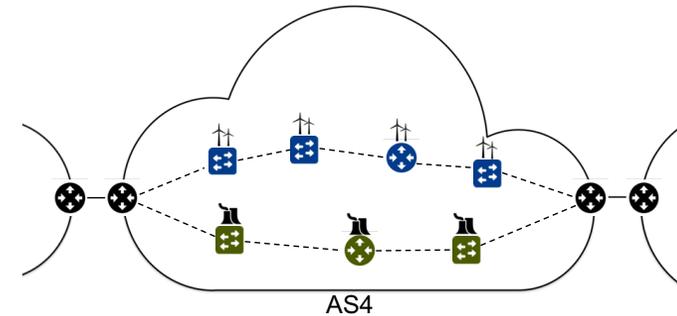
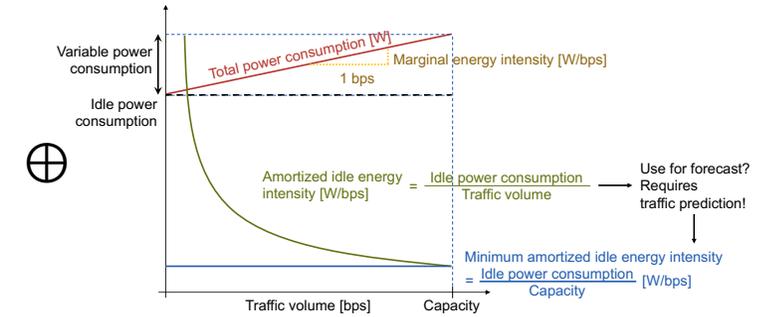
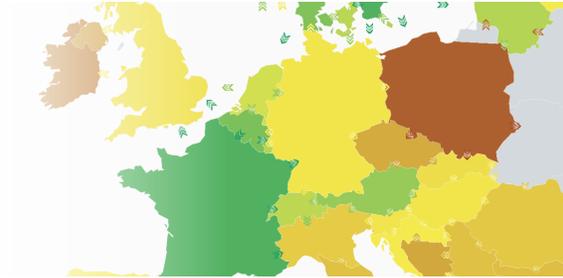
Carbon intensity of intra-network paths



Carbon intensity of network with respect to interface pair



Carbon intensity of Internet path

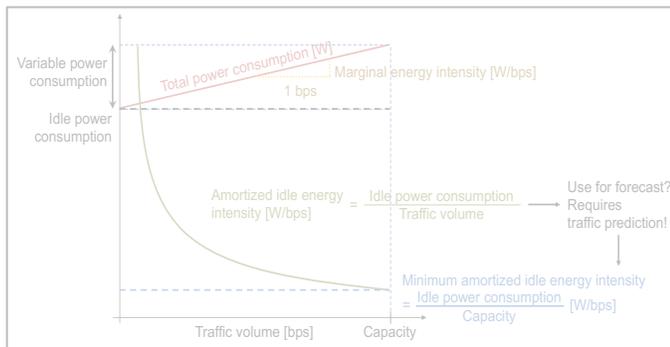


# Carbon-Aware Inter-Domain Routing

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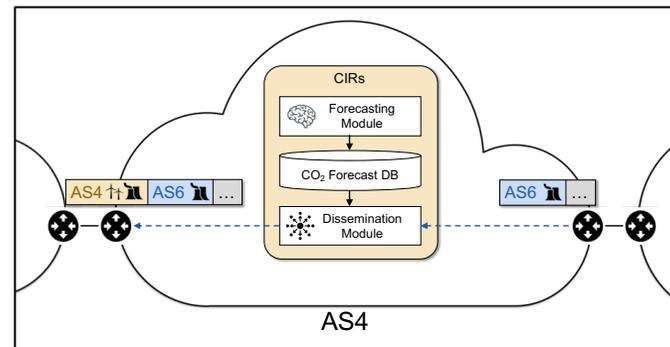
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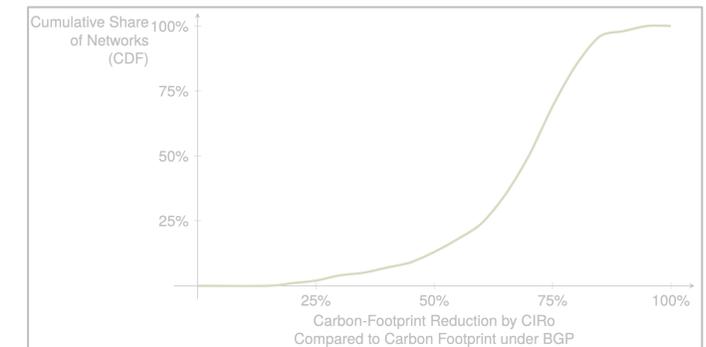
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System for timely communication of forecasts

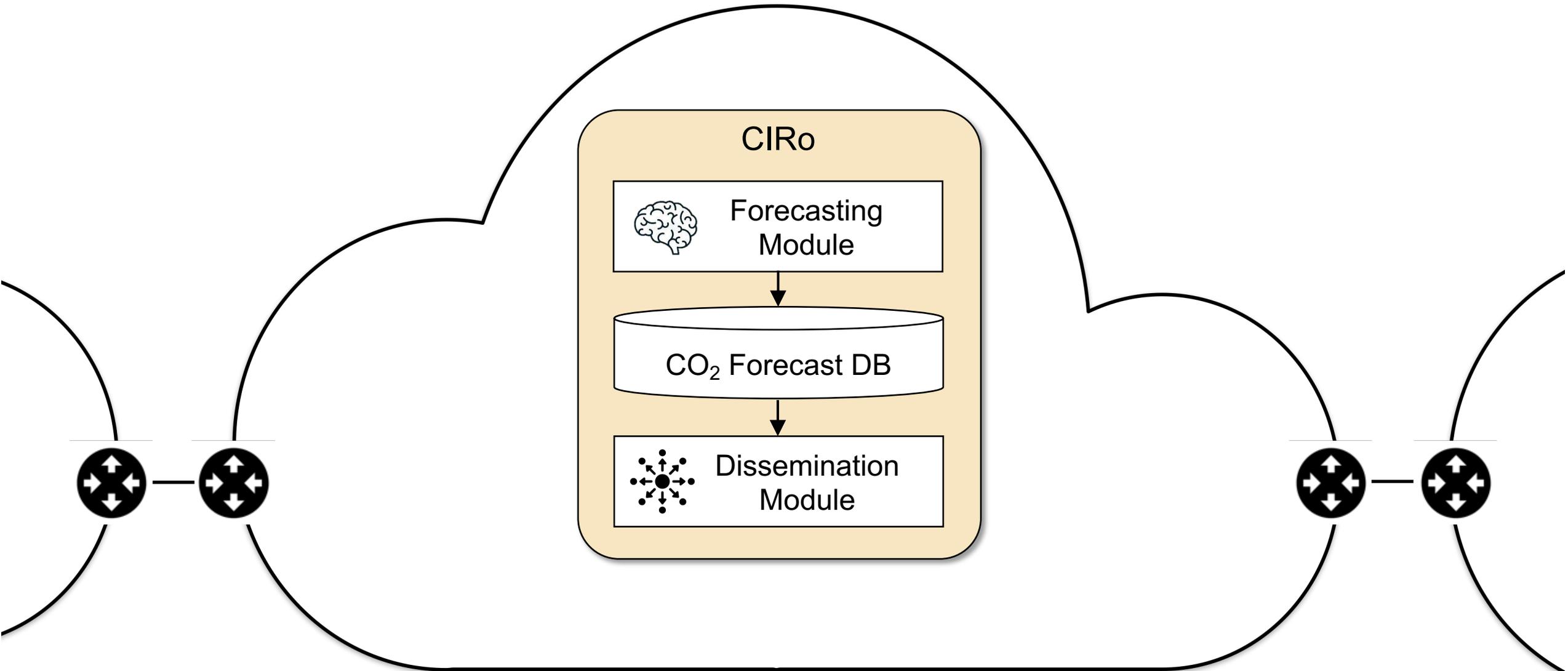


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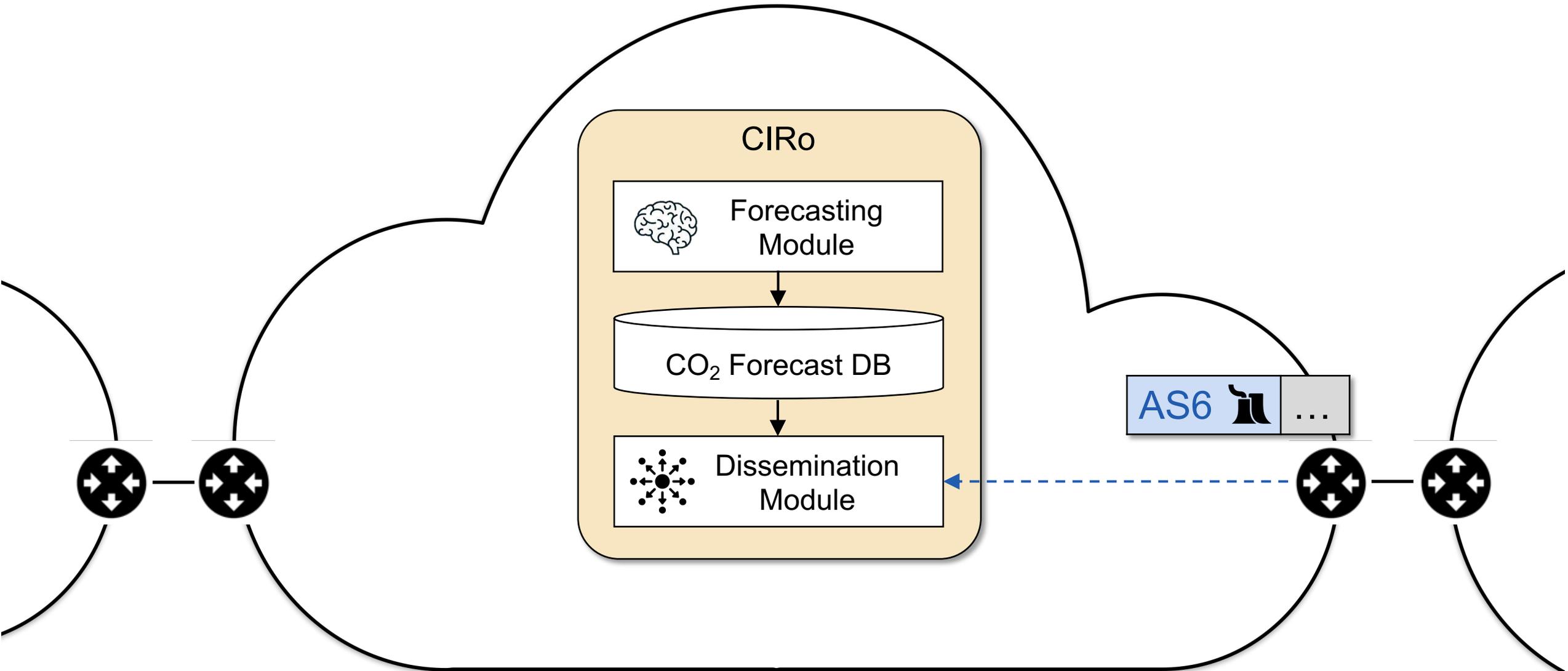
Simulation on data-backed large-scale topology



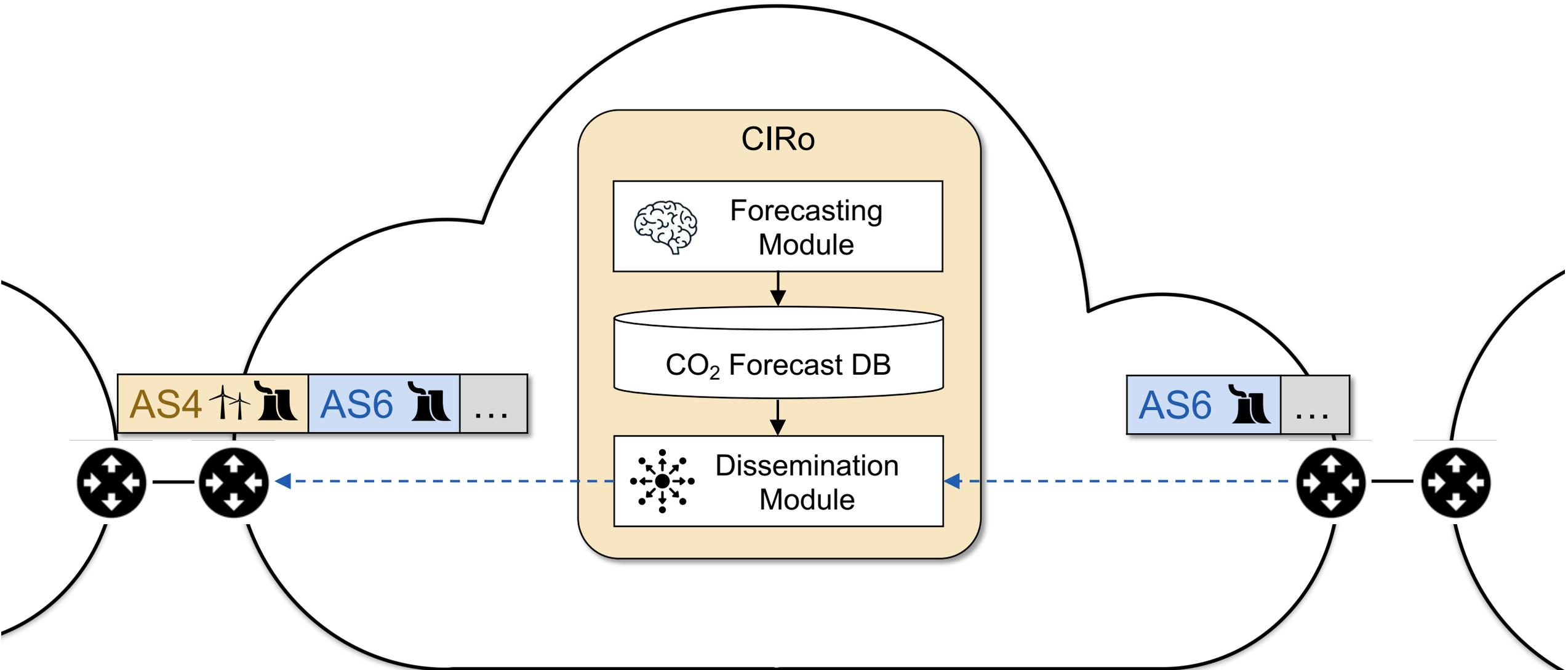
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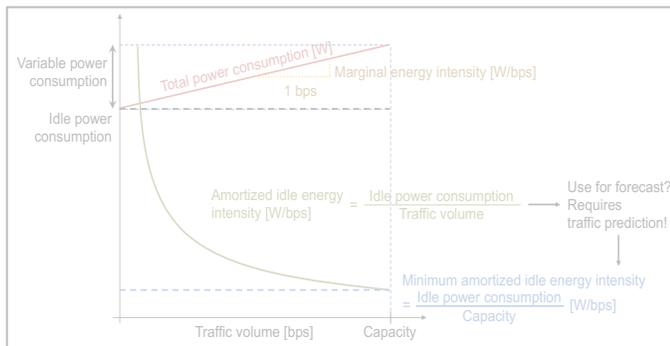


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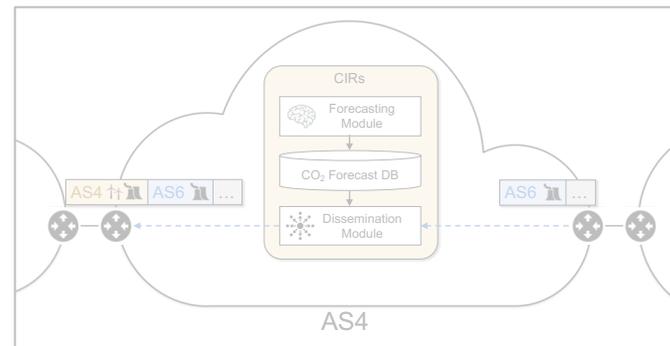
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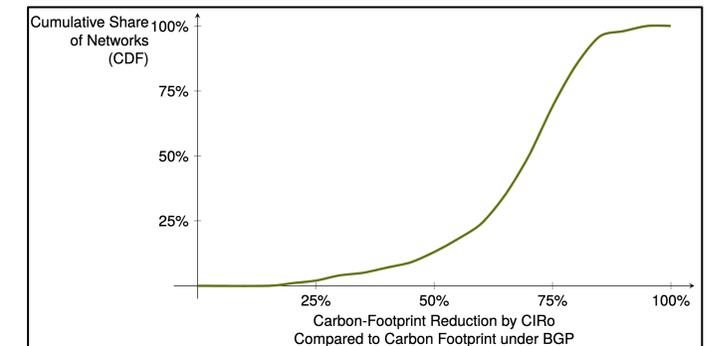
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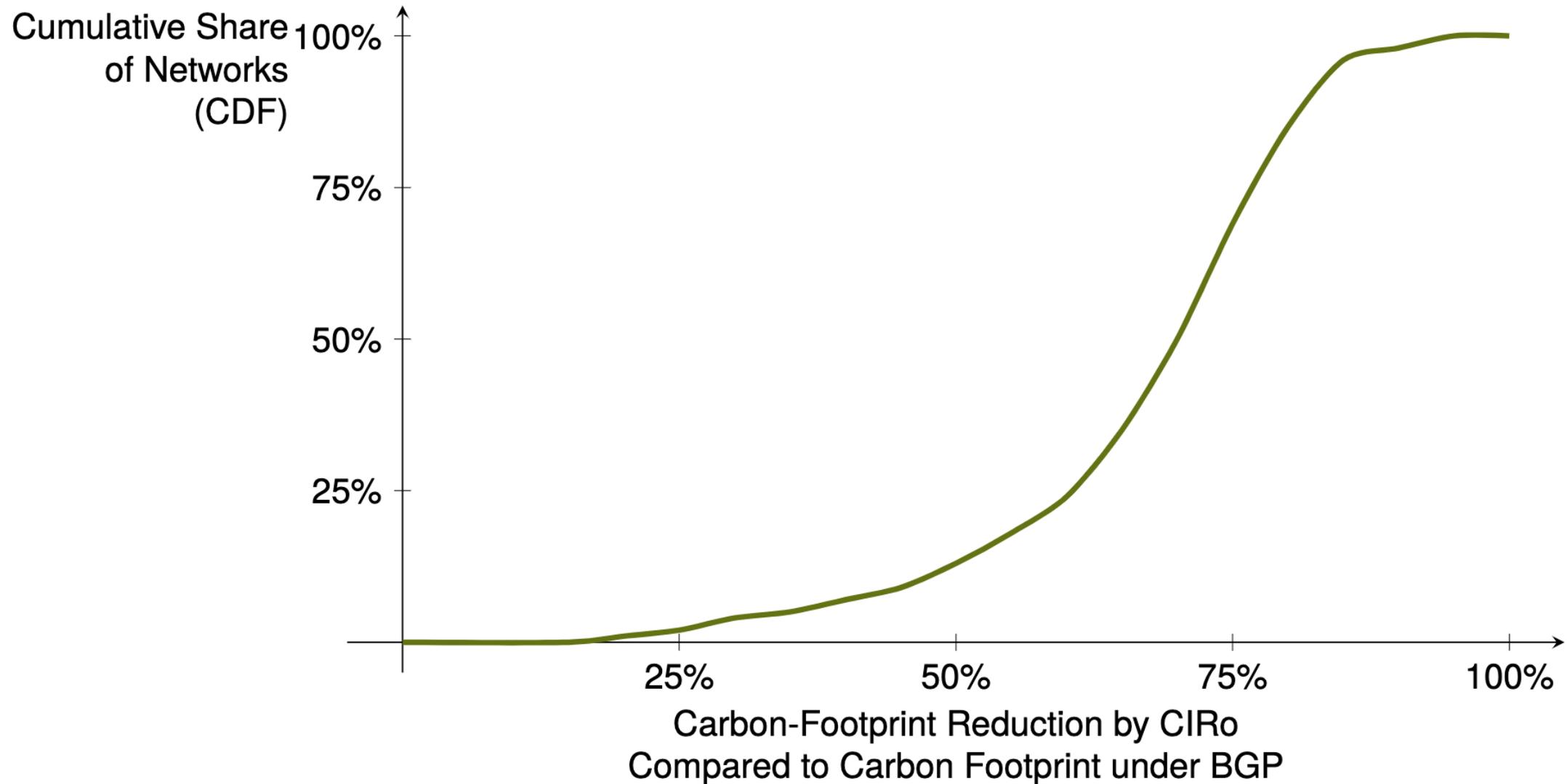


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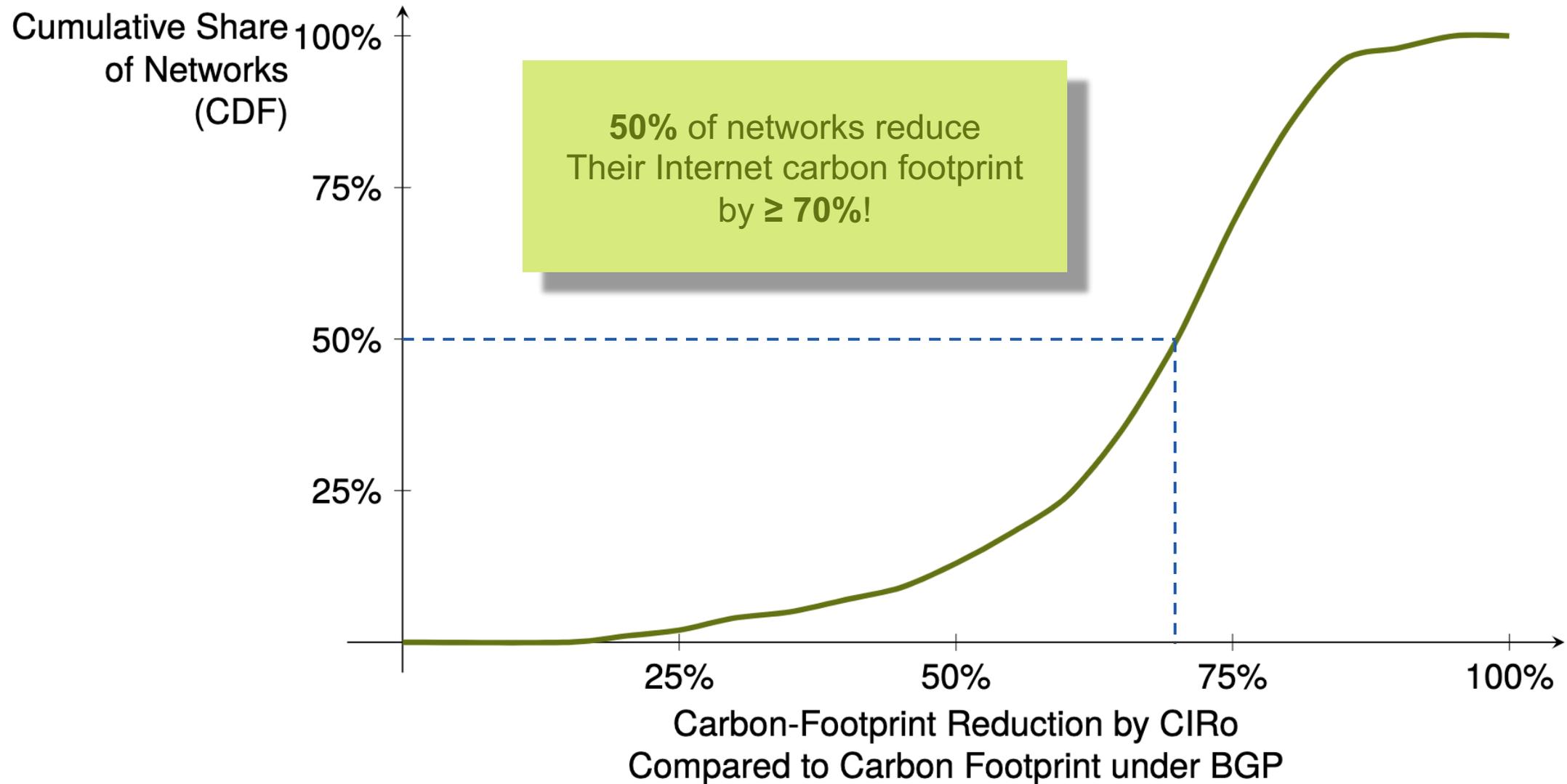
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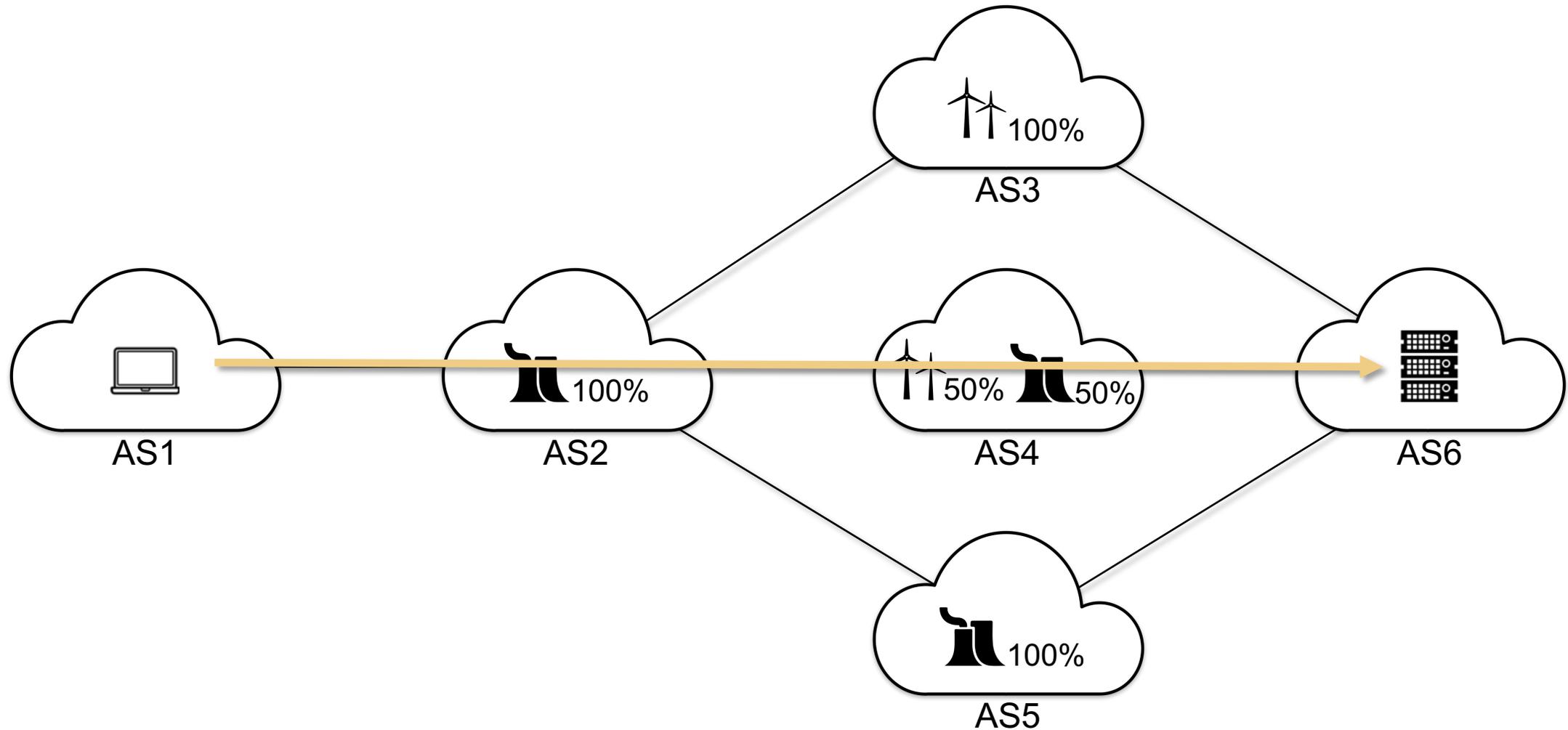
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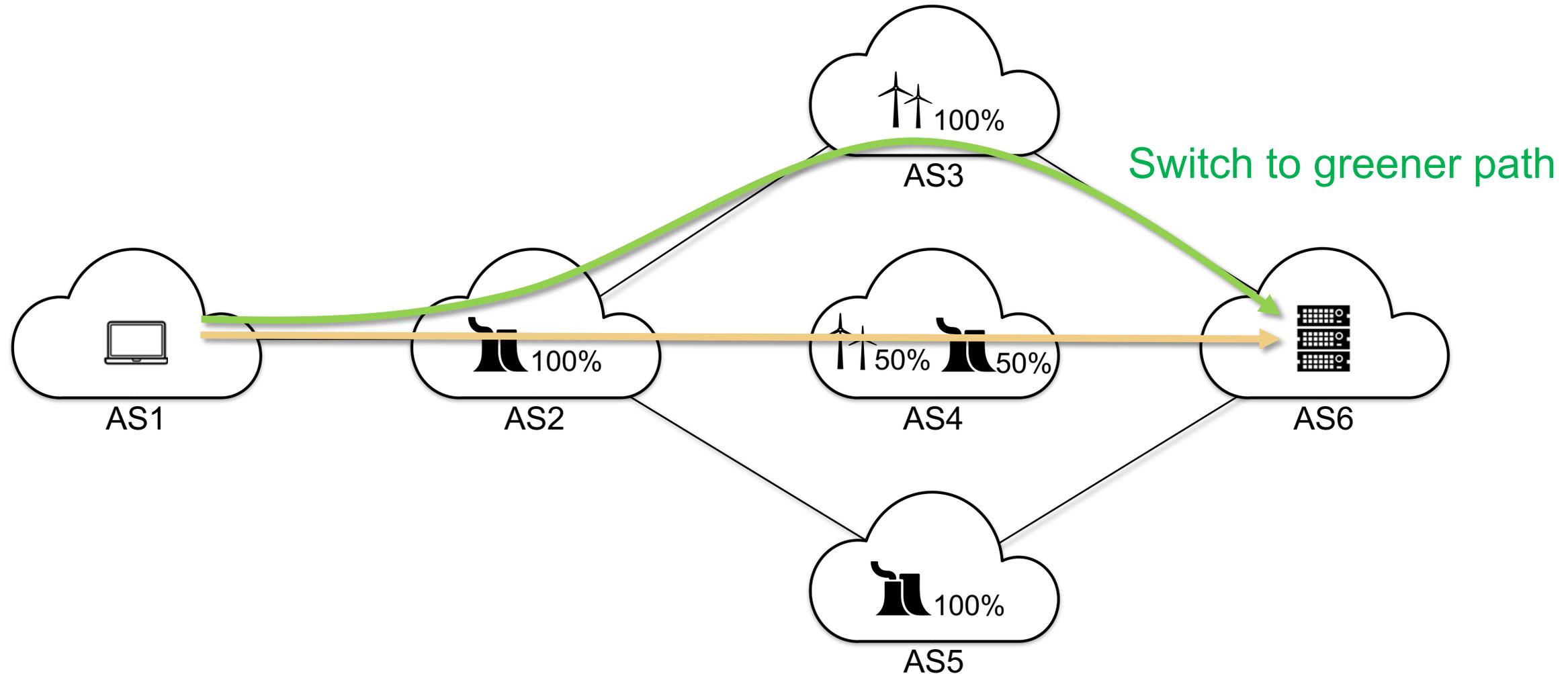
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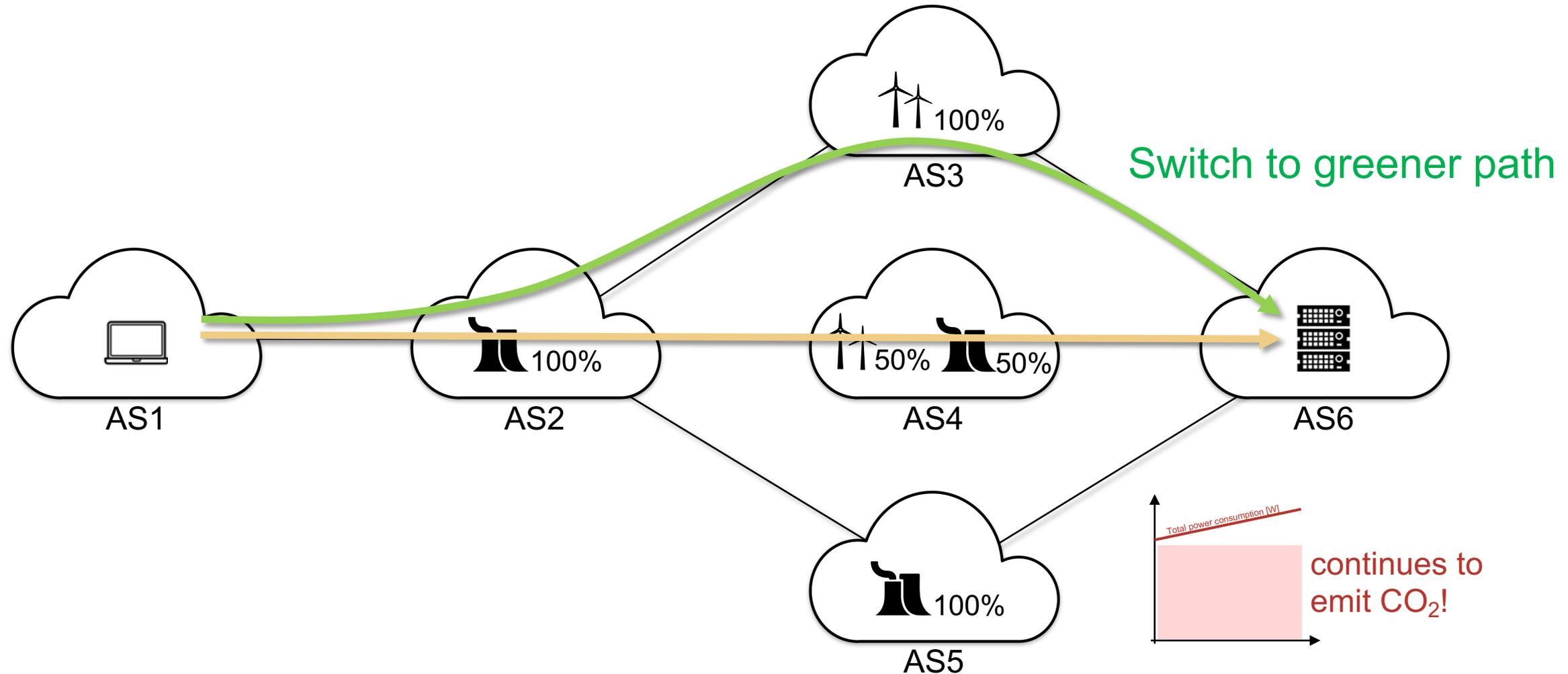
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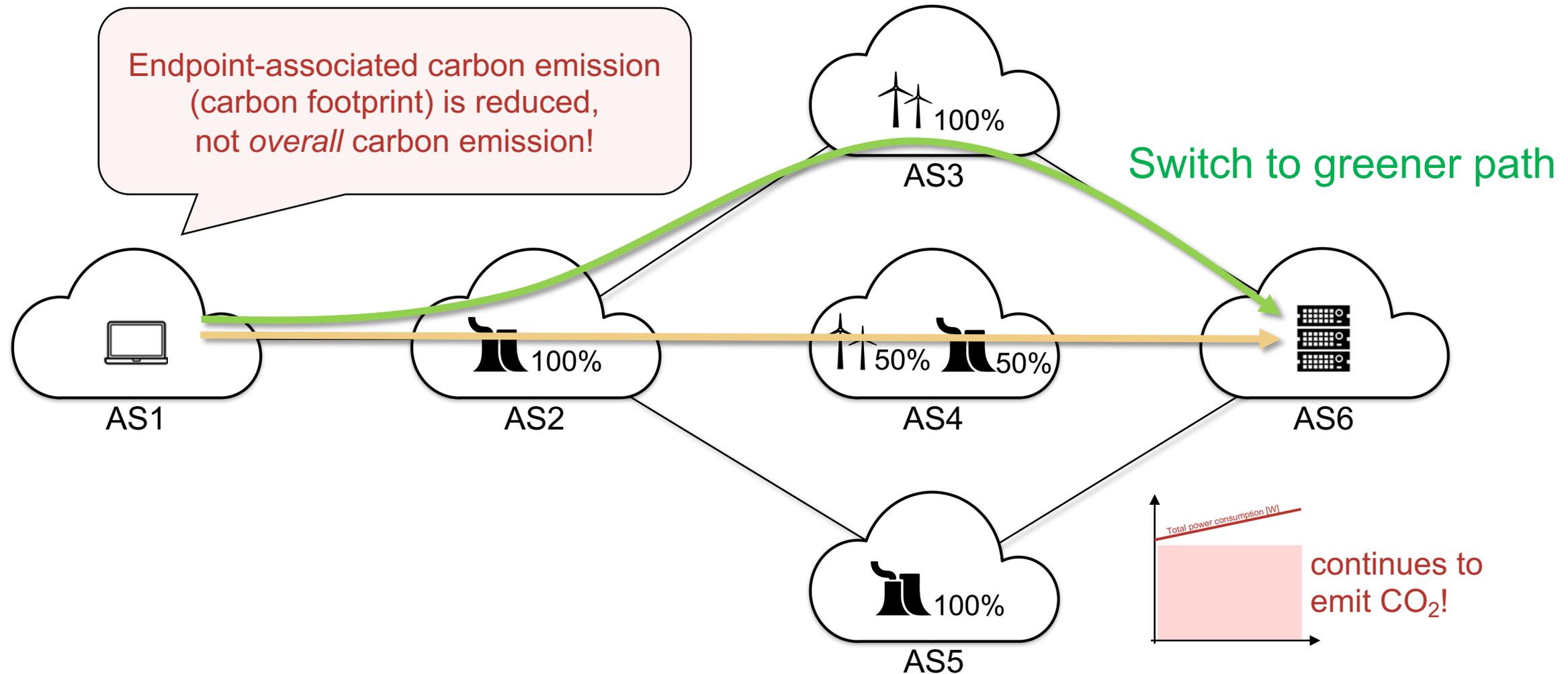
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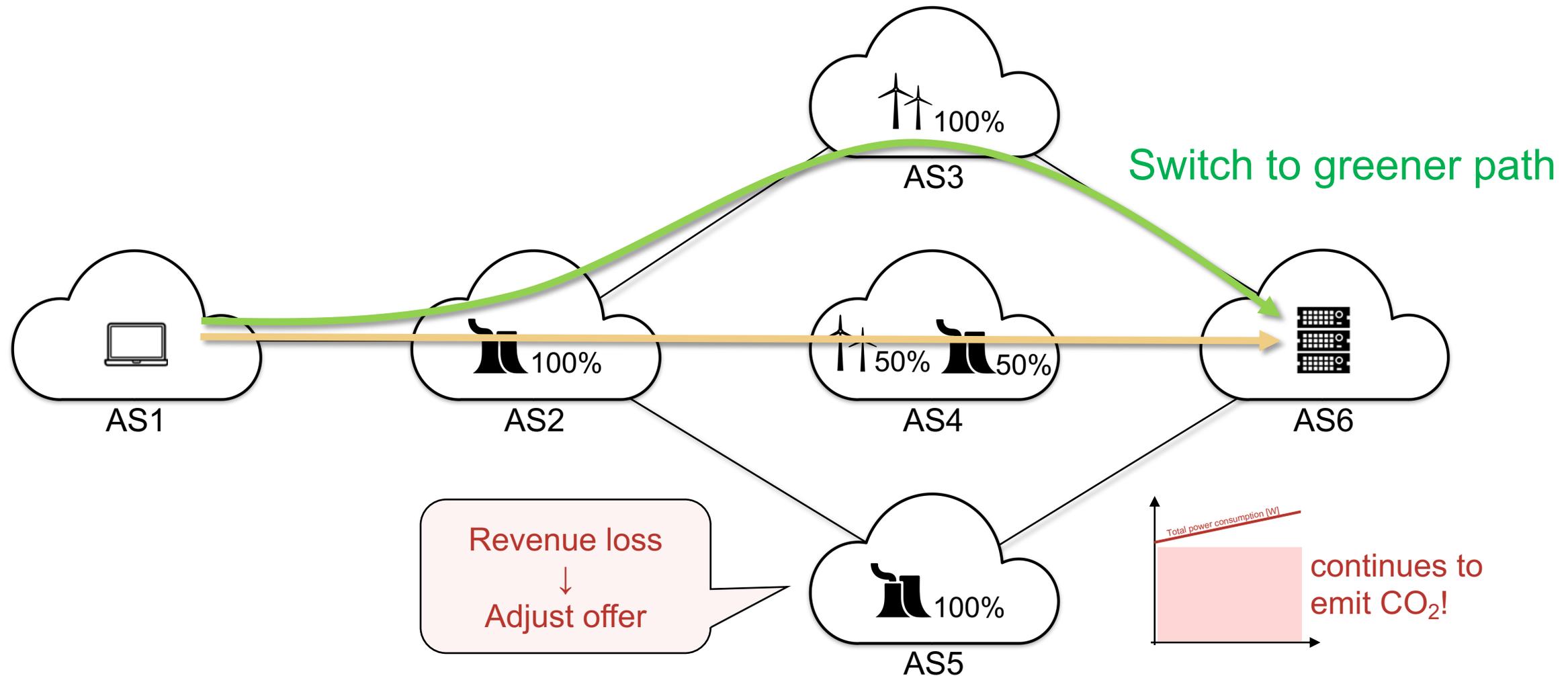
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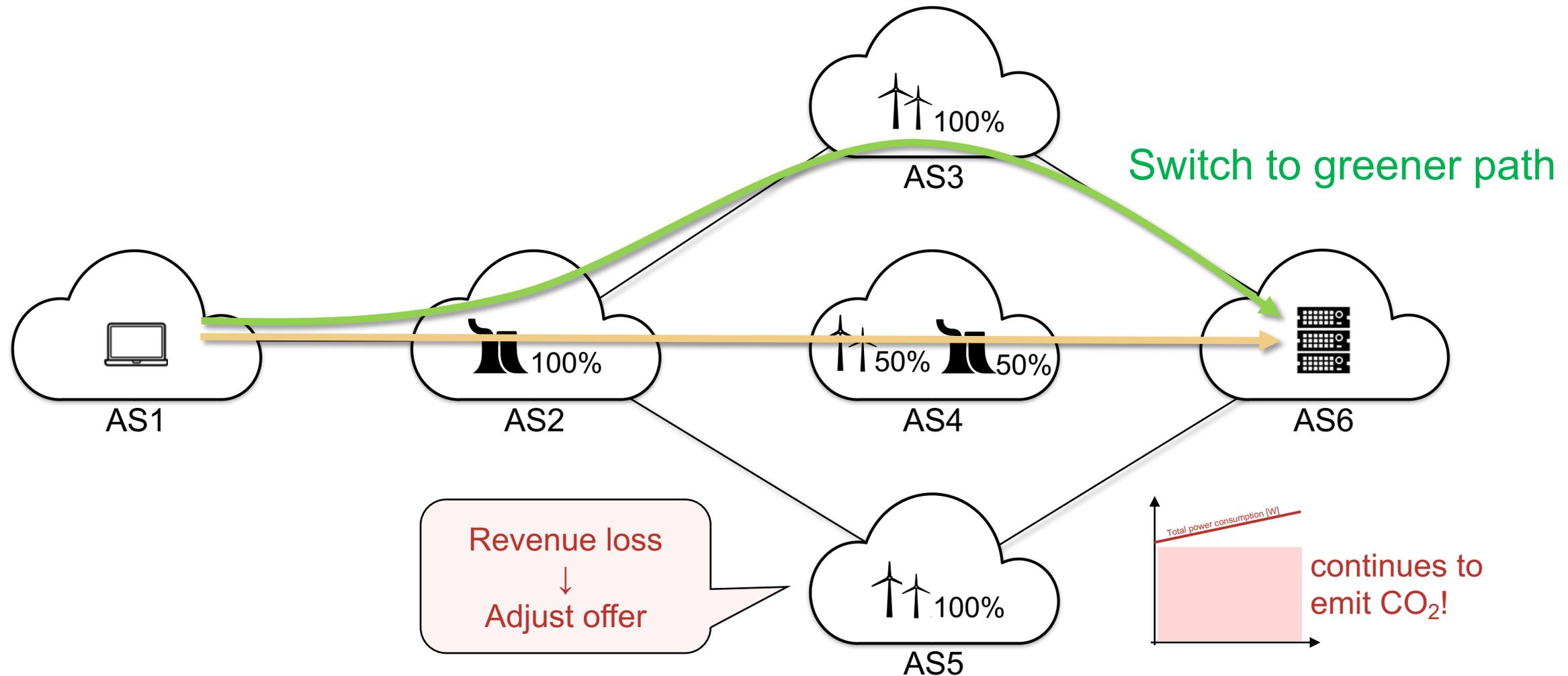
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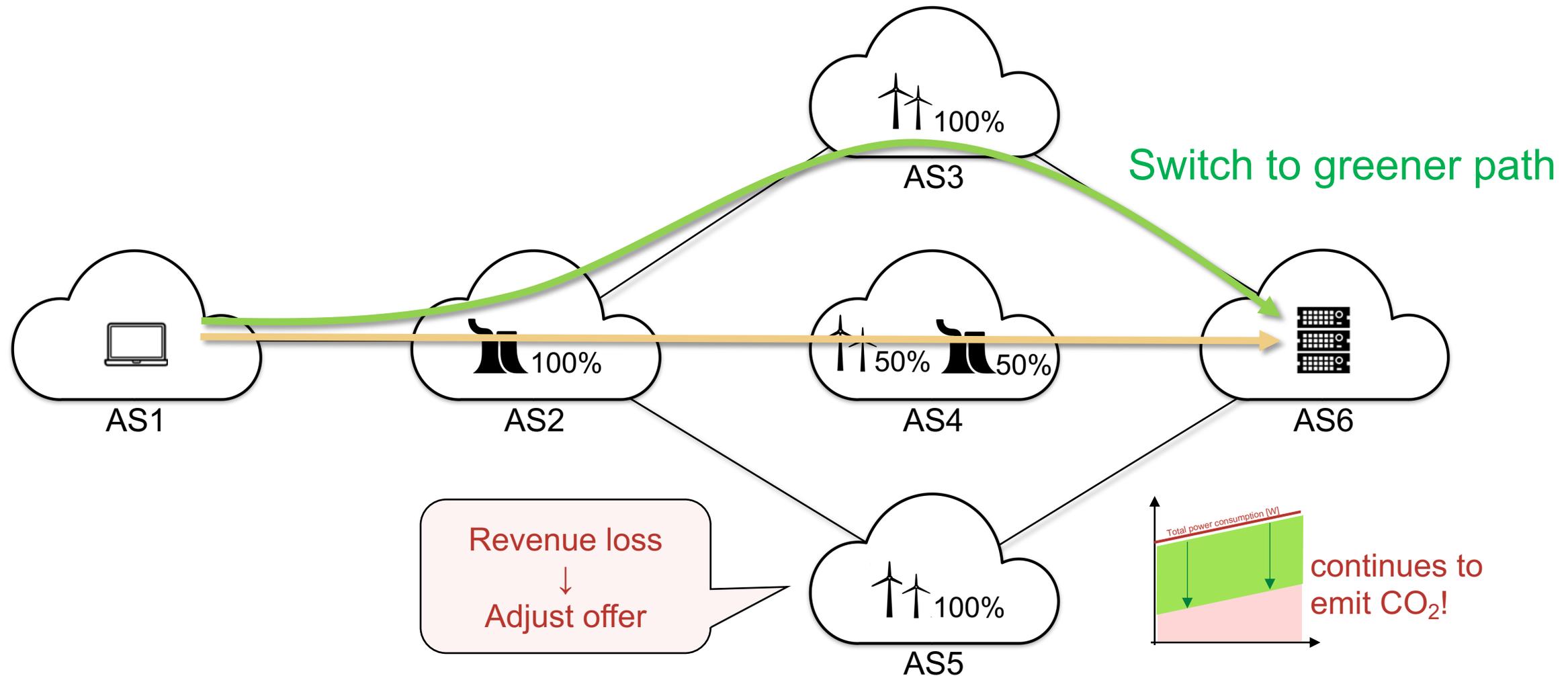
# How to Actually Reduce Emission?



# How to Actually Reduce Emission?



# How to Actually Reduce Emission?



# Carbon-Aware Global Routing in Path-Aware Networks

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Simon Scherrer  
ETH Zürich

Adrian Perrig  
ETH Zürich

## ABSTRACT

The growing energy consumption of Information and Communication Technology (ICT) has raised concerns about its environmental impact. However, the carbon footprint of data transmission over the Internet has so far received relatively modest attention. This carbon footprint can be reduced by sending traffic over carbon-efficient inter-domain paths. However, challenges in estimating and disseminating carbon intensity of inter-domain paths have prevented carbon-aware path selection from becoming a reality.

In this paper, we take advantage of path-aware network architectures to overcome these challenges. In particular, we design CIRo, a system for forecasting the carbon intensity of inter-domain paths and disseminating them across the Internet. We implement a proof of concept for CIRo on the codebase of the SCION path-aware Internet architecture and test it on the SCIONLab global research testbed. Further, through large-scale simulations, we demonstrate the potential of CIRo for reducing the carbon footprint of endpoints and end domains: With CIRo, half of domain pairs can reduce the carbon intensity of their inter-domain traffic by at least 47%, and 87% of end domains can reduce their carbon footprint of Internet use by at least 50%.

## CCS CONCEPTS

• **Applied computing** → **Forecasting**; **Multi-criterion optimization and decision-making**; • **Networks** → **Network measurement**; **Network simulations**; **Network performance modeling**; **Data path algorithms**; **Control path algorithms**; Topology analysis and generation; • **Hardware** → **Renewable energy**.

## KEYWORDS

Green Networking, Internet Carbon-Emission Modeling and Measurement, Inter-Domain Routing, Carbon-Aware Routing, SCION

## ACM Reference Format:

Seyedali Tabaeiaghdaei, Simon Scherrer, Jonghoon Kwon, and Adrian Perrig. 2023. Carbon-Aware Global Routing in Path-Aware Networks. In *The 14th ACM International Conference on Future Energy Systems (e-Energy '23)*, June 20–23, 2023, Orlando, FL, USA. ACM, New York, NY, USA, 15 pages. <https://doi.org/10.1145/3575813.3595192>

## 1 INTRODUCTION

Growing concerns regarding climate change encourage companies to measure and reduce their carbon footprint, i.e., the amount of carbon emission that can be attributed to them. This also applies to their use of Information and Communication Technology (ICT), as ICT has a notable contribution of 2.7% to global CO<sub>2</sub> emissions [39], which is expected to grow significantly – approximately four times – until 2030 [3]. Hence, reducing the carbon footprint of ICT use is becoming increasingly relevant for enterprises, manifesting in carbon-neutrality statements of major technology corporations.

While these efforts are laudable and impactful, promising opportunities for further carbon-footprint reduction exist. Indeed, previous research has identified a range of such opportunities. However, most of these proposals apply to local aspects: intra-domain networking (i.e., within a single domain), data-center optimizations, or neighbor-domain cooperation (cf. §8). In contrast, inter-domain networking (i.e., among multiple domains), which accounts for around 13% of total ICT energy consumption, has so far received less attention. An exception is the work by Zilberman et al. [70] who identify carbon-aware networking as a high-potential research area and sketch the concept of carbon-intelligent routing, i.e., leverage differences in network paths' carbon intensity (i.e., carbon emission per unit of data transmitted) to reduce the carbon footprint of communications.

Previous research on green inter-domain networking leveraged carbon efficiency to the optimization metric of the Border Gateway Protocol (BGP) [42]. Unfortunately, this direction faces several challenges. **Inefficient Green Route:** A strict carbon-aware routing can result in a highly inefficient end-to-end path, incurring a high cost, latency, bandwidth, loss, or jitter (cf. §8.1). To meet the application requirements, an optimization of the routing constraints needs to be made, requiring a more fine-grained metric space. **Ossification:** Carbon-aware routing can thus only be offered as additional optimization options, rather than the conventional BGP route. When carbon-aware routing offers efficient alternative paths, routing tables, routing tables, and packets need to be updated according to optimization criteria. Updating routing tables and packets presents a challenge – as

# More in the Paper

## Carbon Intensity Modeling

Inter-Domain CIDD  
Per-Hop CIDD  
Single Path CIDD

## Detailed System Design

Forecasting Module  
Dissemination Module  
Header Design

## Evaluation

SCION vs. BGP  
Carbon intensity vs. Latency

# Summary

The first Internet-wide carbon footprint monitoring system

Enabling endpoints to select the greenest paths

Introduces green competition between ISPs

Expected savings: 20% CO<sub>2</sub> reduction for global ISPs

# Q&A

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