

# Monitoring Carbon

## Monitorama - Portland OR

Adrian Cockcroft - @adrianco - June 2022

The background of the slide features a photograph of a sunset or sunrise. A large, round sun is positioned in the lower-left quadrant, partially obscured by the dark silhouettes of tree branches. The sky above the horizon is a deep blue, transitioning to warmer orange and yellow hues near the sun. A few small, isolated stars are visible in the upper left corner of the image.

We're used to reporting and optimizing  
throughput, latency, utilization, capacity, cost...

A photograph of a sunset or sunrise. The sun is a large, luminous sphere, appearing orange and yellow at its center, transitioning to a darker red at the edges. It sits behind a dark, silhouetted line of trees. The sky above the horizon is a deep blue, with a few small, faint stars visible.

Carbon is just another metric for monitoring  
tools to report

Regulators and market pressure are going to  
make everyone report carbon and decarbonize  
their products and services



The background of the slide features a photograph of a sunset or sunrise. A large, partially obscured sun is visible through a dark, silhouetted line of trees at the bottom of the frame. The sky above is a deep blue, transitioning to a warm orange and yellow near the horizon where the sun is located.

How can we decarbonize our products and services?

First we need to know how much carbon we emit and  
where most of it is coming from



How much carbon does your company emit, for  
“data processing and hosting” per year?



How can we get to an answer?

How much \$ does your company spend on  
“data processing and hosting” per year?



Economic Model for Carbon:  
159 metric tons of CO<sub>2</sub> equivalent per \$M spent on  
data processing and hosting





## Climatiq Data Explorer - Search Global Carbon Emission Factors

Data processing and hosting	EPA	2020	United States	Information and Communication	Information and Communication Services
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Emission intensity of supply chain (with margins i.e. cradle to shelf) in US dollars spent on: data processing and hosting. This factor is representative of the described commodity (equivalent to a goods or services category) and was calculated from 2016 data applying IPCC 4th Assessment Report conversion factors.

ID	communication_services-type_data_processing_hosting	
SOURCE	<a href="#">EPA</a>	
YEAR RELEASED	2020	
REGION	United States (US)	
UNIT TYPE(S)	<a href="#">Money</a>	
EMISSION FACTORS	CO <sub>2</sub> e: 0.159 kg/USD	
CO <sub>2</sub> e CALCULATION	Method applied: AR4 Methods supported: AR4 Origin: Source	
LCA ACTIVITY	Cradle_to_shelf	
<a href="#">View examples in API Reference</a>		

# Economic Model for Carbon:

1. Break down spend categories
2. Find the right emissions factor
3. Multiply and accumulate

# Economic Model - The Good

- Everyone uses economic models
- Big picture approximate view
- Input data is always available from finance
- Industry standard emissions factors that update regularly
- Auditors can trace the calculations easily
- Estimates entire life cycle

# Economic Model - The Bad

- It's a coarse model
- Emissions factors are based on old data
- It can be hard to pick the right factor
- If you spend more, reported carbon goes up
- Carbon optimizations have no effect

# Economic Model - The Ugly

If you report economic based carbon one year, then get a more accurate measure, it could be a lot higher, even if you reduced carbon...



# Economic Model - Recommendations

Start here, use spend when no other data is available, use economic models to identify where to focus efforts for accurate metrics



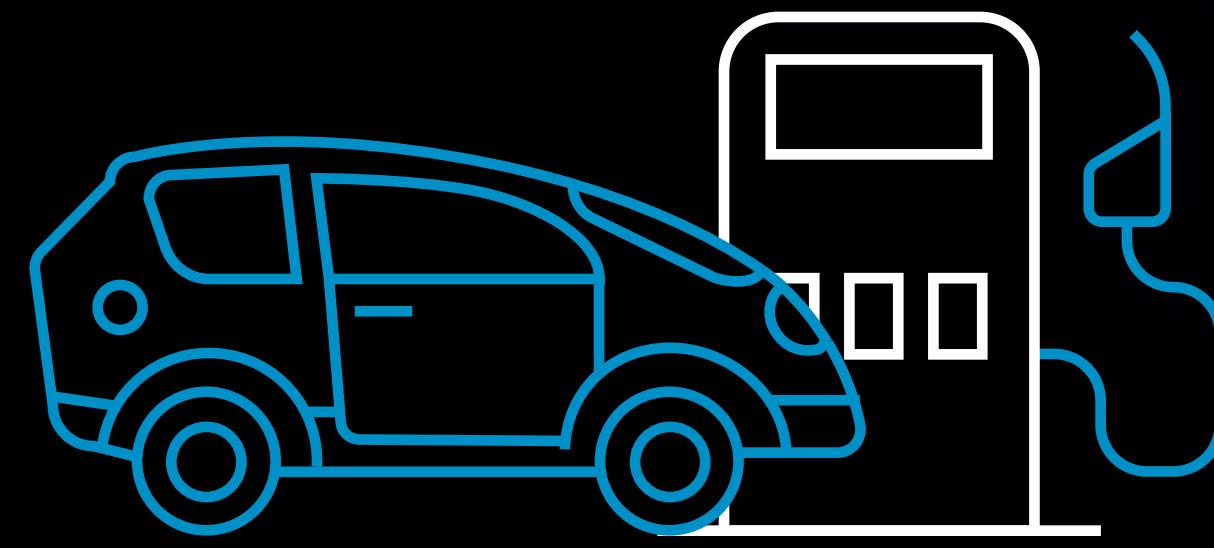
# Scopes of Carbon

(Using some slides I made for AWS)



# Scope 1—fuel consumed

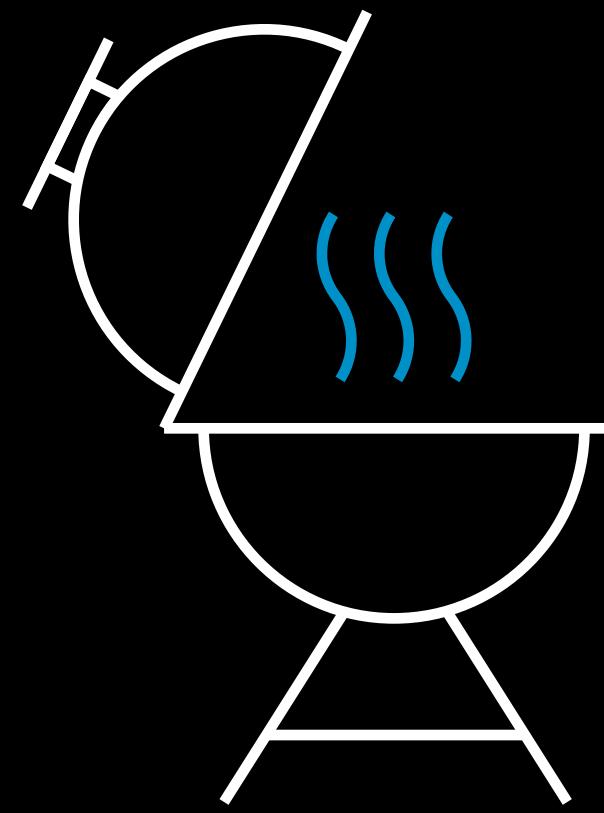
COUNTED BY WHOEVER OWNS THE FUEL WHEN IT BURNS



Car



Gas pump

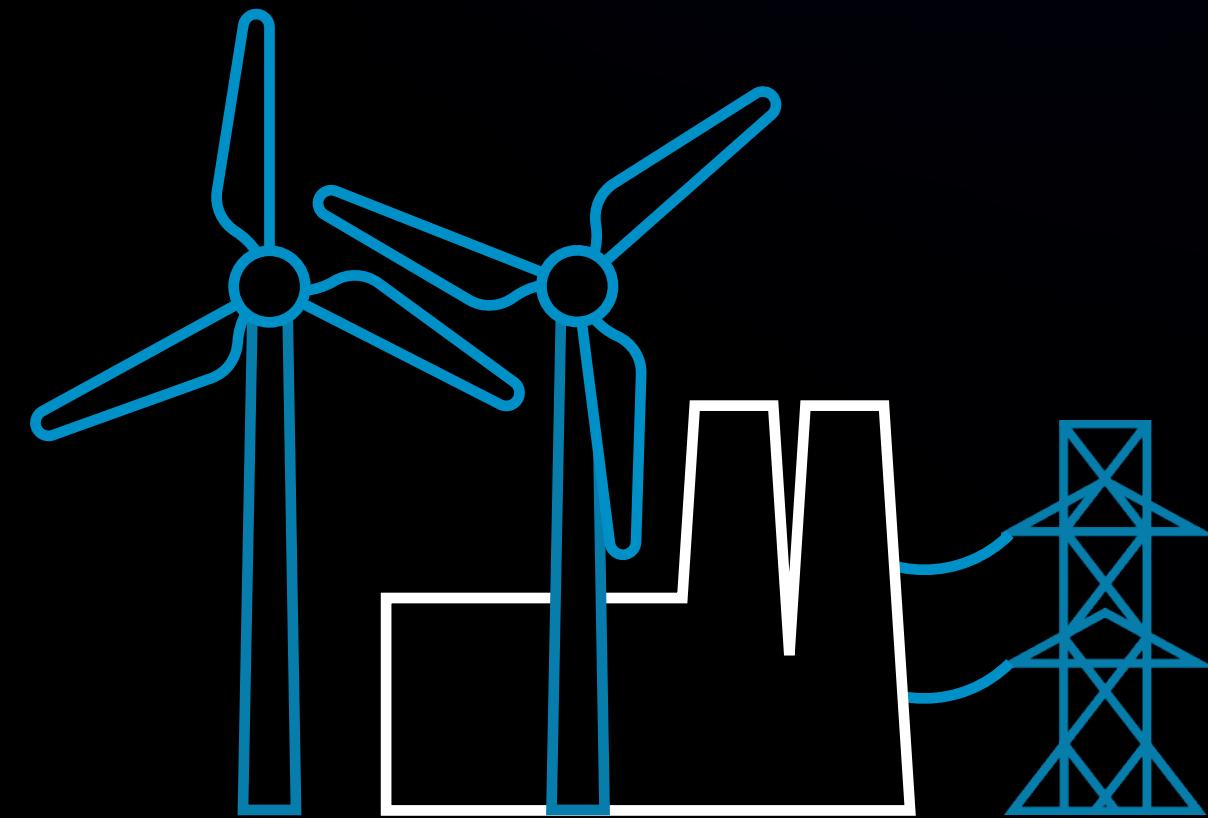


Cooking

Electrify everything to take Scope 1 to zero

# Scope 2—energy used

ELECTRICITY USE IS COUNTED ONLY ONCE WHERE IT IS CONSUMED



Windmill

Power station

Grid mix

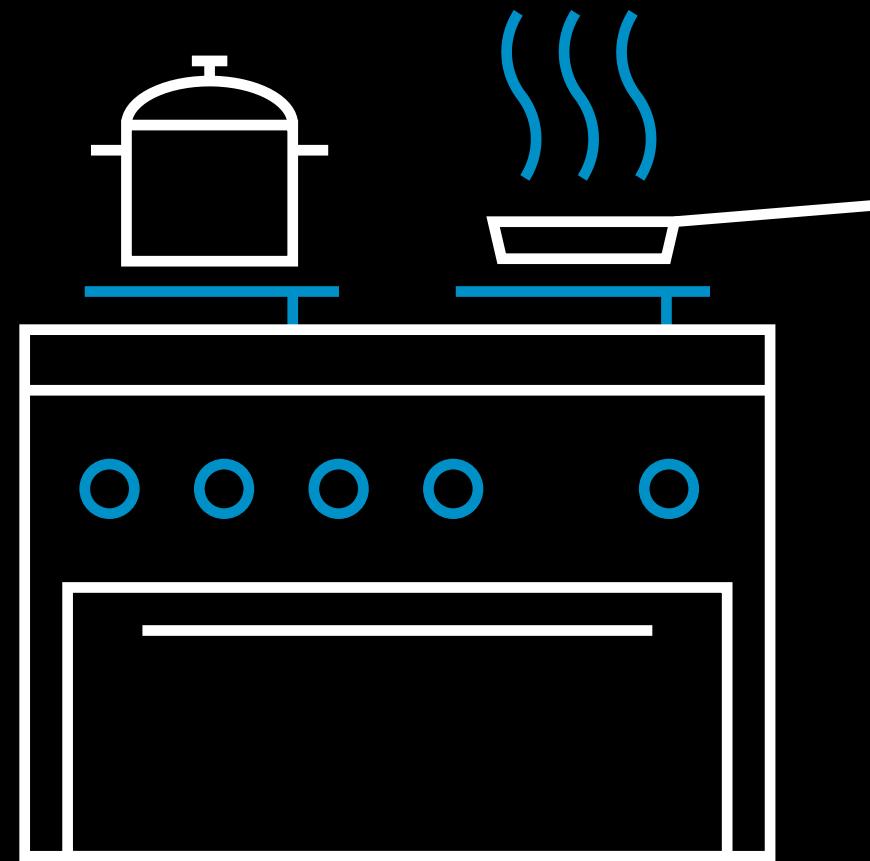


Heat pump

Solar panels

Batteries

Electric car



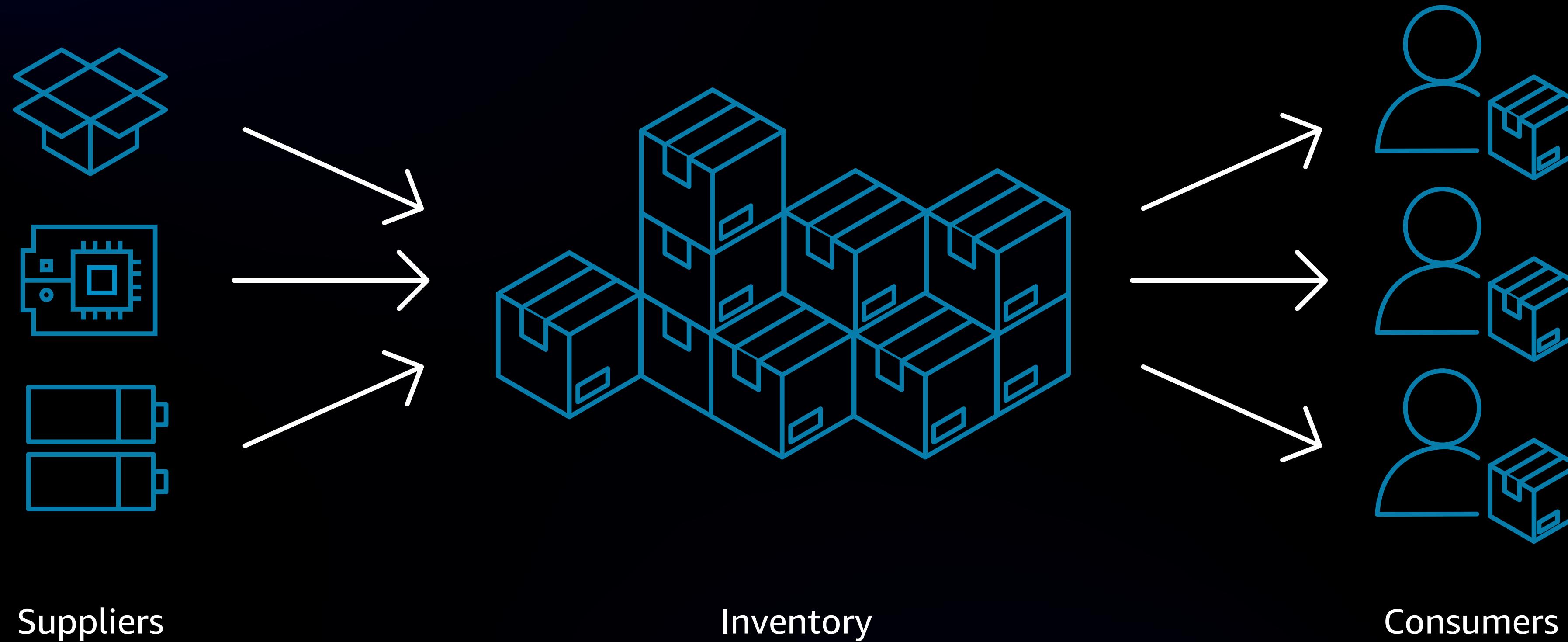
Induction range

(gas ranges are also a big cause of indoor pollution that leads to asthma)

Change grid mix to renewable power and store renewable energy in batteries to reduce Scope 2

# Scope 3—everything else

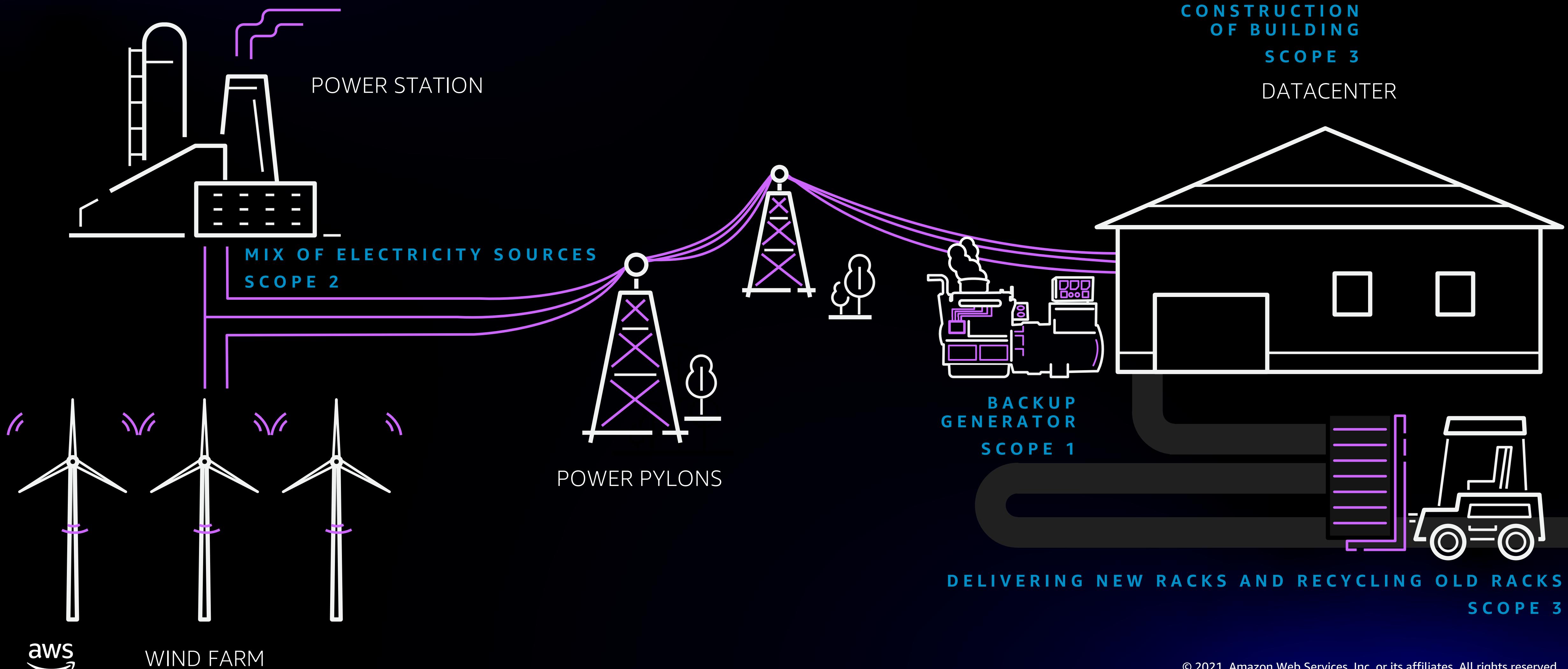
## SUPPLY CHAIN AND INVESTMENTS



Scope 3 depends a lot on what kind of business you are in

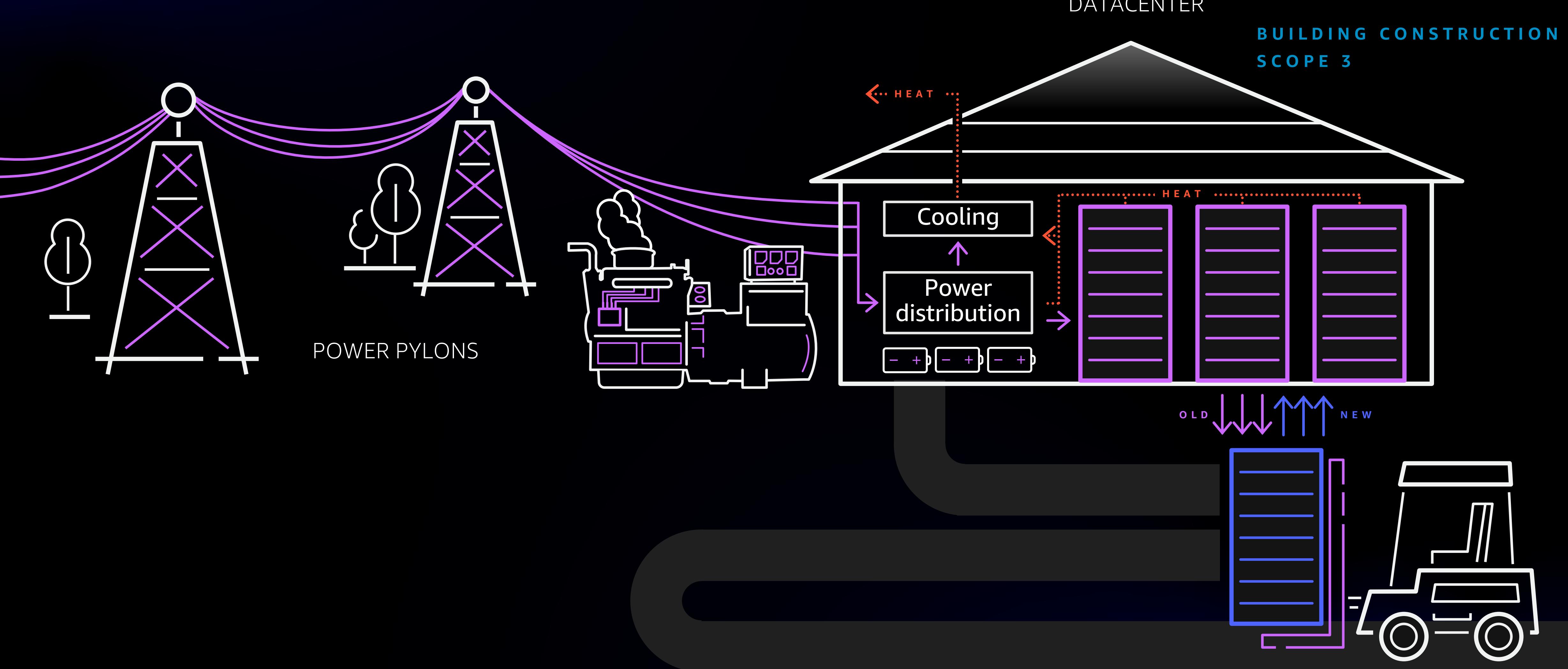
# The carbon footprint of datacenters

## TOP-DOWN CONTEXT



# The carbon footprint of datacenters

TOP-DOWN CONTEXT





Your suppliers need to report scope 1,2,3 to you

You need to report scope 1,2,3 to your customers

Greenhouse Gas Protocol - <https://ghgprotocol.org>

Process Models for Carbon:  
Units are Kg of materials or KWh of energy



# Process Model for Carbon:

1. Measure materials and energy
2. Find the right emissions factor
3. Multiply and accumulate

# Process Models for Carbon:

## Life Cycle Analysis - LCA - Cradle to Shelf Manufacture - Delivery - Use - Disposal

# Process Models for Carbon:

Life Cycle Analysis - LCA - Cradle to Shelf  
Manufacture - Delivery - Use - Disposal



# Process Model - The Good

- LCA models and expertise are available
- Reasonably detailed and accurate
- Energy data fairly easy to get for “Use phase”
- Optimizations reduce reported carbon
- Auditors can trace the calculations

# Process Model - The Bad

- Models are averages for a business process
- Its a lot of work to build an LCA model
- Supply chain and recycle data is hard to get
- Scope 3 emissions are often left out

# Process Model - The Ugly

Some people focus on reducing energy use, and ignore the life cycle, then get surprised when life cycle carbon ends up dominating...

# Process Model - Recommendations

Build LCA process models for the areas that economic models tell you are dominating your carbon footprint.

Start with energy, but don't forget the rest of the life cycle

# Measuring carbon emitted by a workload

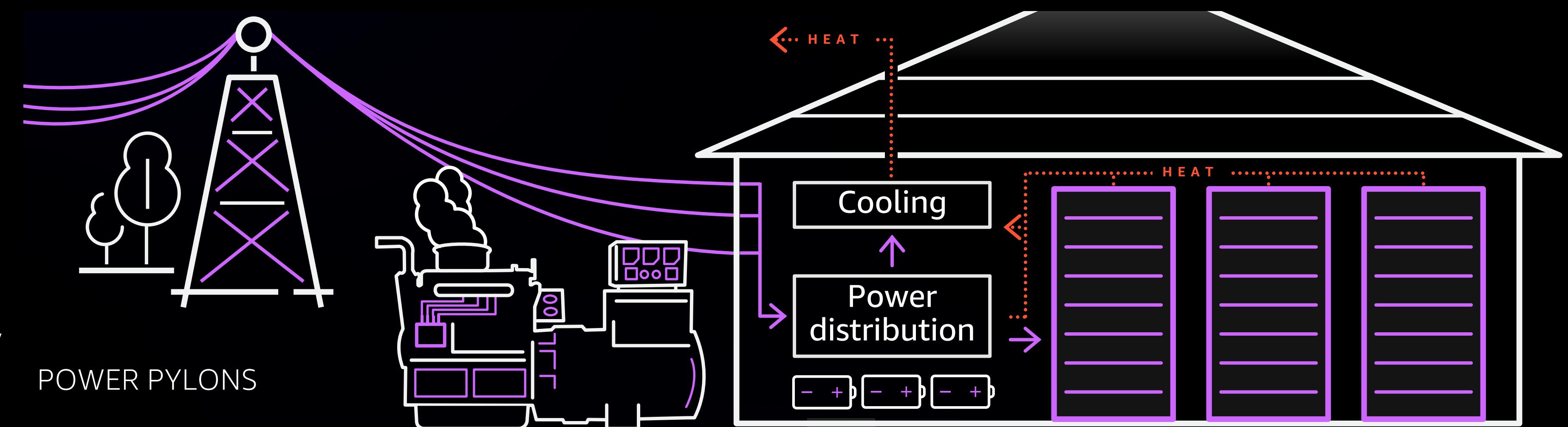


## How hard can it be?

**Power Usage Efficiency (PUE) accounts for losses and cooling overhead but value depends on where it is measured**

**Power distribution and UPS batteries may be centralized or distributed in different datacenter architectures**

**Grid Mix is obtained from the local utility bill, usually a month or so in arrears, combined with any power purchase agreements (PPAs) or renewable energy credit (REC) purchases**



**Scope 2 Carbon = Power Mix \* PUE \* Capacity Used \* Emissions factor per capacity**

# Problems...

Scope 2 Carbon = Power Mix \* PUE \* Capacity Used \* Emissions factor per capacity



Utility bills delayed by a month or more, depending where in the world they are...

PPA - Power Purchase Agreements are contracts to build private power generation capacity  
e.g. Amazon has over 15GW of PPAs (Solar, Wind, Battery) around the world

REC - Renewable Energy Credits are purchases of generation capacity on the open market,  
from existing generators, the energy can only be claimed once

RECs may be used to “top up” on top of PPAs, helps fund existing renewable capacity, but  
doesn’t create additional capacity, like PPAs do

# Problems...

Scope 2 Carbon = Power Mix \* PUE \* Capacity Used \* Emissions factor per capacity



Grid mix changes every month but is mostly getting better over time

Hourly data for 24/7 grid mix starting to appear for some suppliers in some parts of the world

GCP and Azure publicly working towards 24/7

cloudcarbonfootprint.org open source tool estimates are wrong, don't include PPAs

Also see [FlexiDAO.com](#)

# Problems...

Scope 2 Carbon = Power Mix \* PUE \* Capacity Used \* Emissions factor per capacity



Power Usage Efficiency is not well standardized. Values can be compared for similar datacenter designs, but some good efficiency improvements may move components from the infrastructure to the equipment, and make PUE look worse. See:

<https://perspectives.mvdirona.com/2009/06/pue-and-total-power-usage-efficiency-tpue/>

# Problems...

Scope 2 Carbon = Power Mix \* PUE \* Capacity Used \* Emissions factor per capacity



Dedicated compute and storage capacity is relatively easy to account for, but sliced instances, shared services, network equipment etc. are a challenge to allocate

If you are operating a multi-tenant service and want to report carbon, then you have a problem figuring out how much capacity to allocate to each customer, and how much is overhead that you should own yourself...

# Problems...

Scope 2 Carbon = Power Mix \* PUE \* Capacity Used \* Emissions factor per capacity



Need to know how much power each instance type, storage class or service uses  
This varies based on utilization and other overheads confuse measurements

Some data is available for some systems...



What can you do today?

For carbon audits:  
Cloud vendor reports  
On-prem economic models  
More accurate but not useful



# Cloud Vendor Reports



AWS - Customer Carbon Footprint - Billing Console - Free  
Market based scope 1 & 2, audited but currently very low resolution  
Europe and US regions near zero carbon today, global zero by 2025

Azure - Microsoft Sustainability Manager - Dynamics - \$\$  
Market based scope 1 & 2, audited, high resolution  
Europe and US regions report near zero carbon today

GCP - Carbon Footprint - Tool, API - Free  
Location based scope 1 & 2, not audited, high resolution  
Easiest place to build workload optimization products today

# Market vs. Location

CO<sub>2</sub> is globally mixed  
So saving carbon anywhere helps, but that gets harder over time



Power grids are markets for energy  
Power generation and use occur in different locations  
but adding renewable capacity reduces fossil capacity in that market

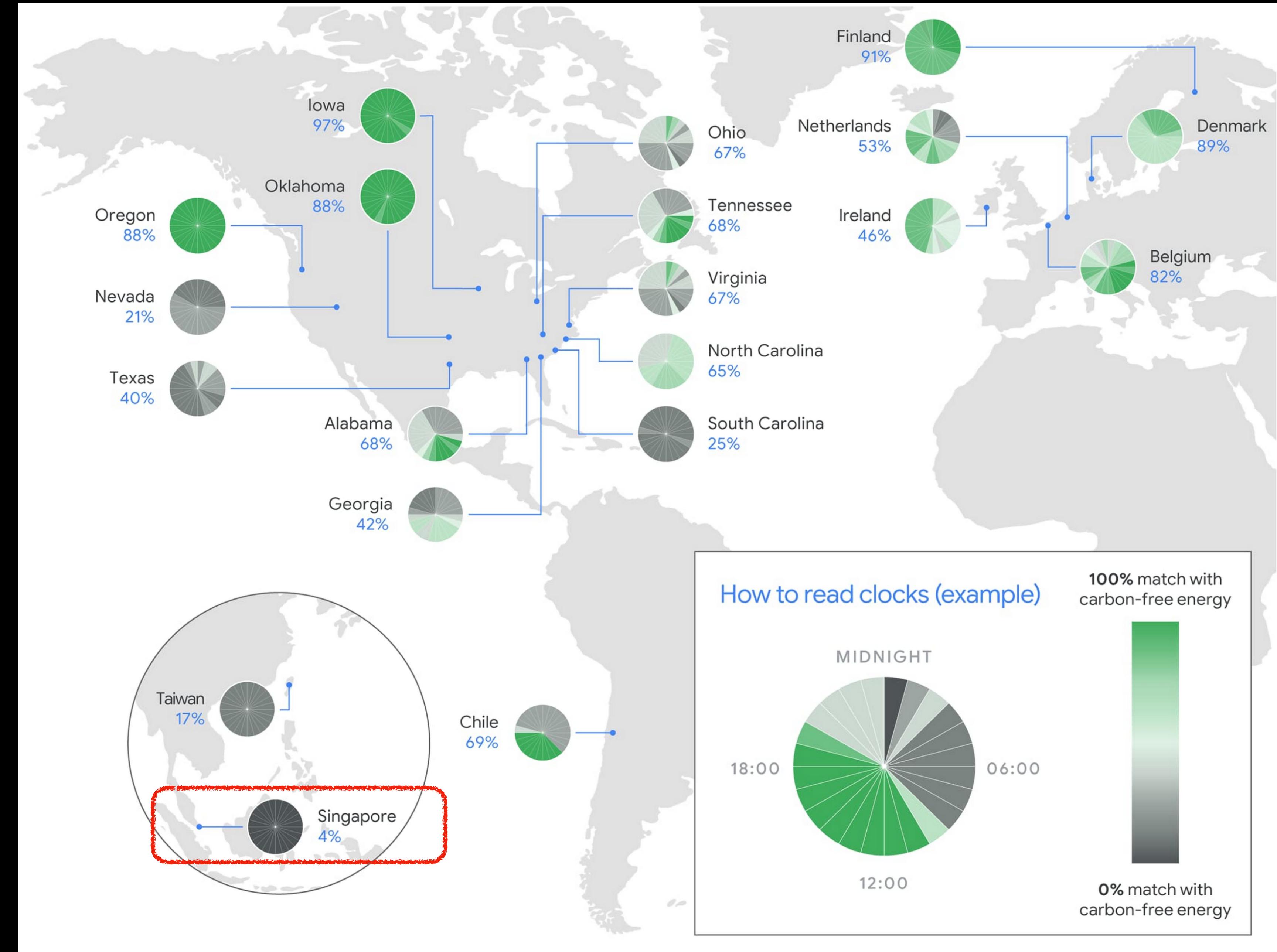
Google's location based reports don't include their PPAs  
AWS and Azure market based reports do include PPAs and RECs...

What about offsets that remove carbon?  
Differing policies and opinions

# Google Cloud Regions

% carbon free energy by location and time of day

Asia is the problem for everyone





For workload optimization:

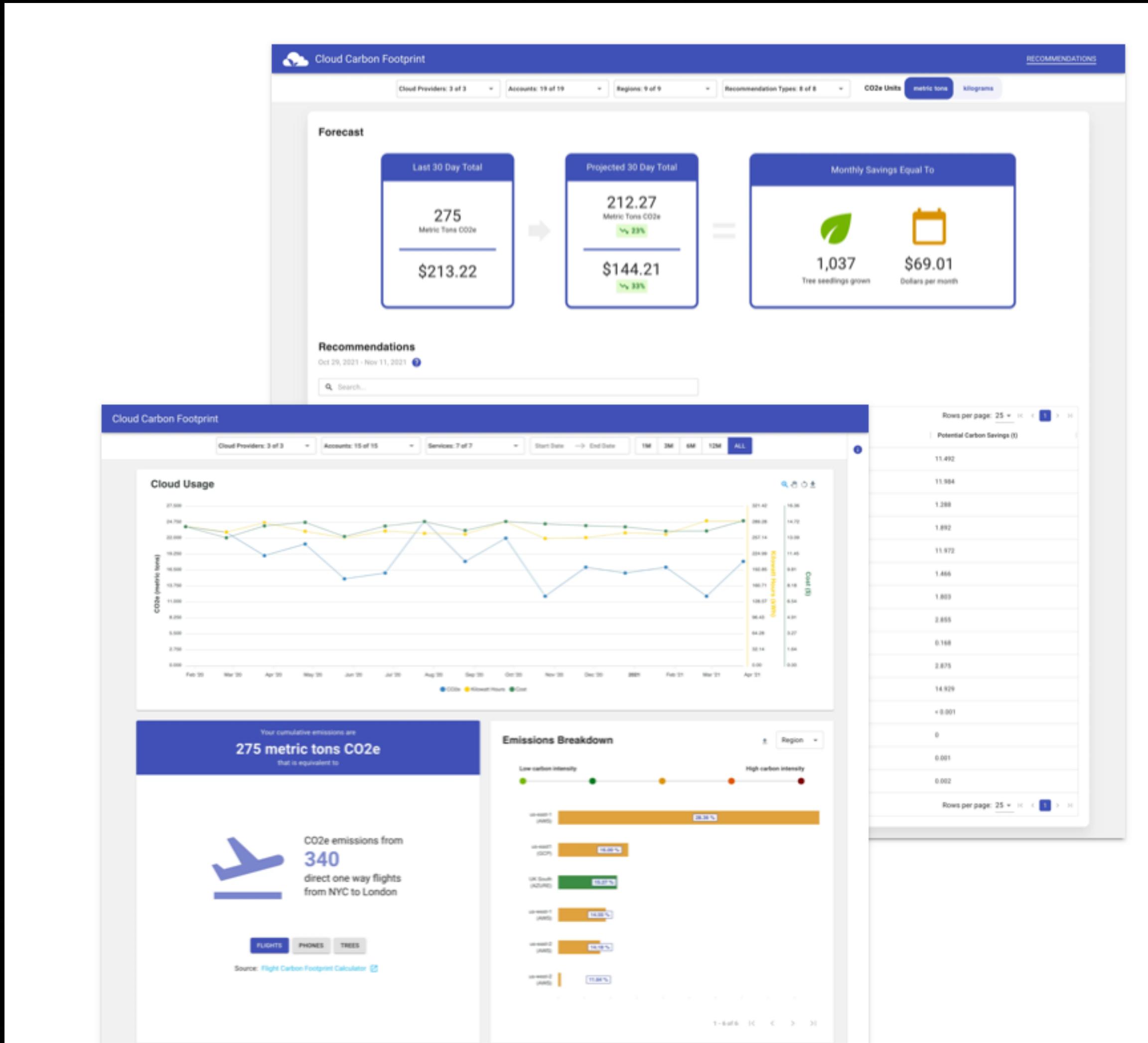
Cloud Carbon Footprint open source tool

Green Software Foundation SCI

More useful but not accurate

Directional and proportional guidance

# Cloud Carbon Footprint tool



[cloudcarbonfootprint.org](http://cloudcarbonfootprint.org)

• Use for tuning exercises within a region, to find where to focus on optimizing workloads

Comparisons across regions and vendors don't have access to enough underlying data to be useful



# Green Software Foundation

**SCI is a model for carbon per unit of work  
e.g. carbon per API call or transaction**

<https://greensoftware.foundation/projects/software-carbon-intensity-sci-specification>

[https://github.com/Green-Software-Foundation/software\\_carbon\\_intensity](https://github.com/Green-Software-Foundation/software_carbon_intensity)



## Cloud Provider Comparison - My Opinions

Not much difference in carbon emissions between providers, they all have lots of PPAs and are all much better than datacenters

Big differences in tooling and transparency

Lots of opportunity for monitoring tools vendors



**Hopefully this was a useful introduction to the complexities and nuances of monitoring carbon**

**DM me @adrianco if you have questions**

# Monitoring Carbon

Moonitorama - Portland OR



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