

National Winner of Climate Launchpad 2019

Climate Risks: Machine intelligence to enable forward-looking risk management

Making companies resilient: measuring sustainability risks



Which cost can I expect resulting from CO₂ prices in the legislations I am operating?



How resilient are global supply chains against natural disasters and how high are expected losses?



How resilient are local productions and logistics against increasingly extreme weather situations?



Which technologies and markets in my portfolio are at risk and where are major opportunities?



How high is the financial risk on my building portfolio and what is an optimal mitigation pathway?



How can I answer questions from investors about my climate risk management and mitigation strategy?

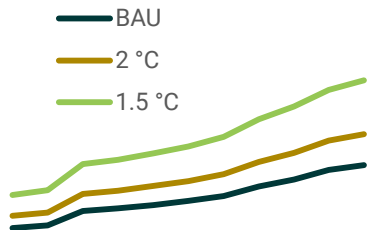
The TCFD financial climate impact framework



Supply chain risks in a changing global environment



CO₂ Risk Site A (M€ cost)



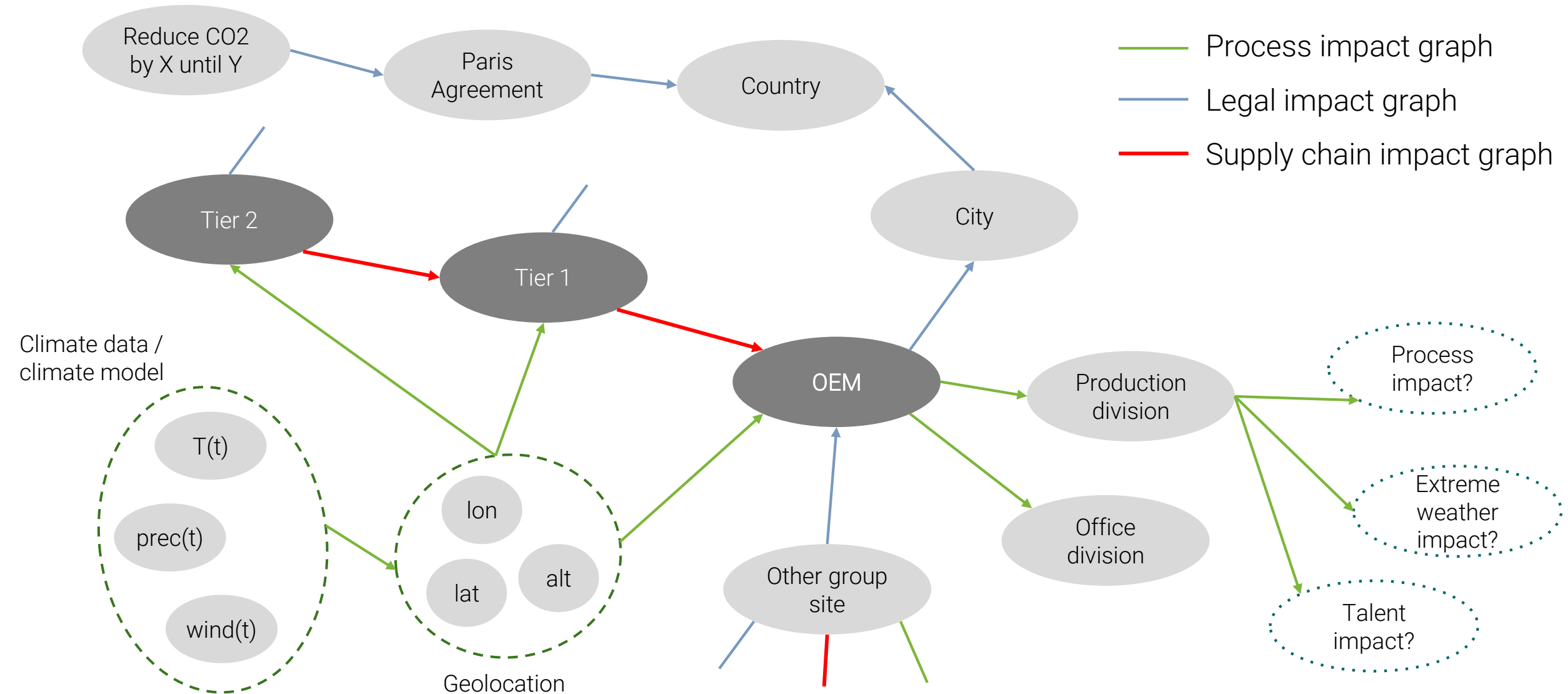
Scenarios include changes in climate, political response

Micro-economic effect of scenarios?

How do companies react on technology and market shifts?

Which companies are early adopters, which are laggards?

Company data is modeled in our enterprise knowledge graph

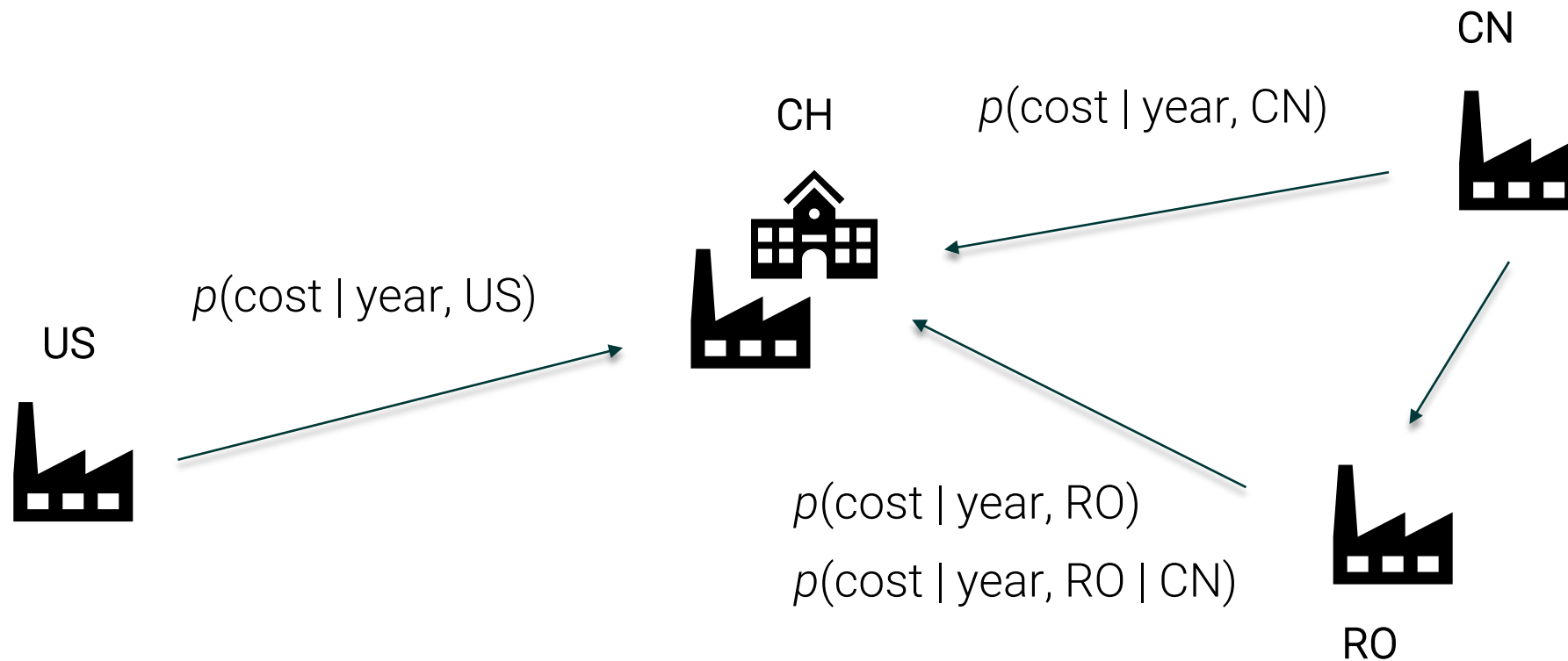


Modeling the impact of carbon pricing in the supply chain...

... with caveats:

- Aggregating all policy impacts into a single, national carbon price figure
- Assuming costs can be fully forwarded through supply chain

Carbon price is represented as probability distribution per country, per year



Though it's a bit more complicated in real live...

$p(\text{cost} \mid \text{year, location, business, policies, processes, management, history...})$

The more we know, the better – we'll augment the rest with samples from distributions

$p(\text{cost} \mid \text{year, location, business, policies, processes, management, history...}) =$

$p(\text{year})$

- $p(\text{location})$

- $p(\text{business})$

- $p(\text{policies} \mid \text{location, year})$

- $p(\text{processes} \mid \text{business})$

- $p(\text{management} \mid \text{history})$

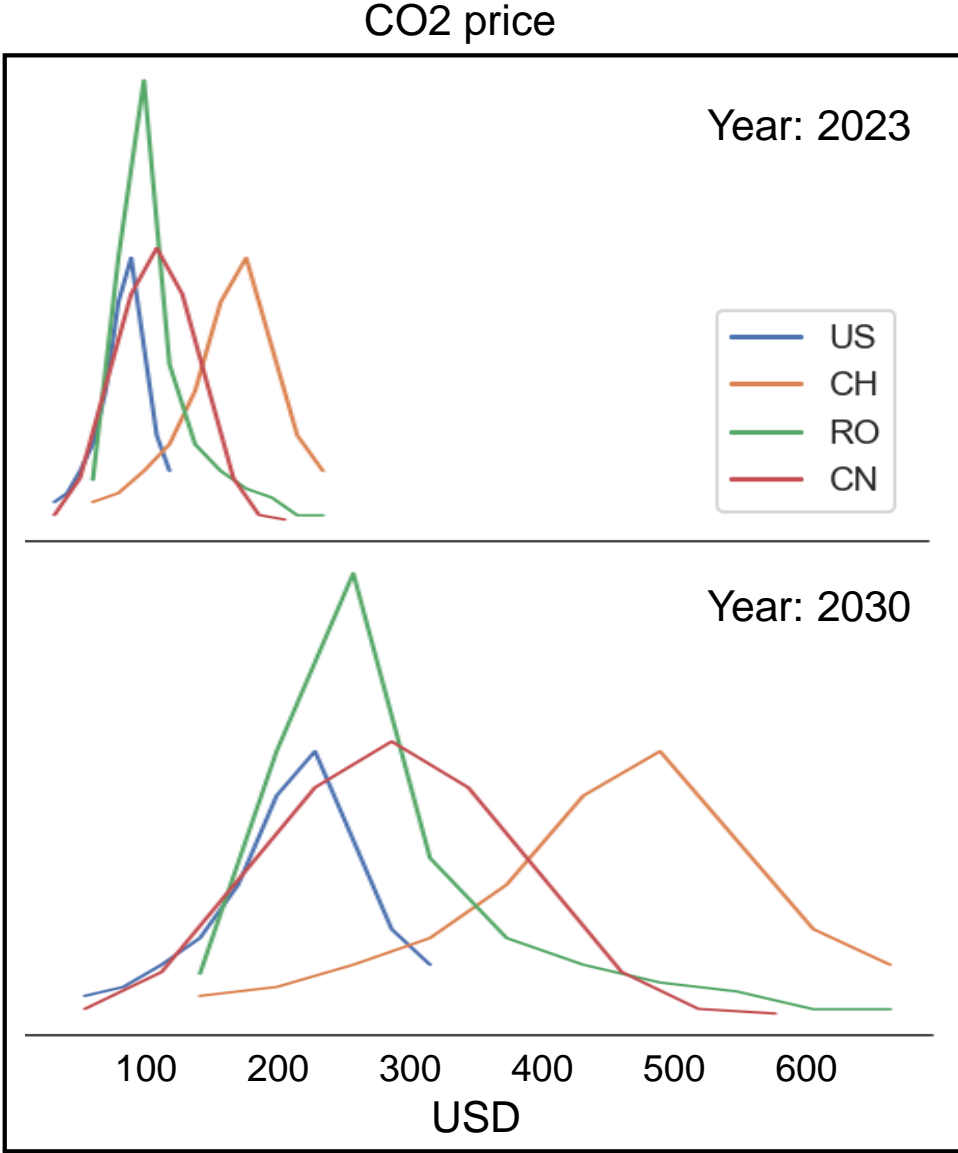
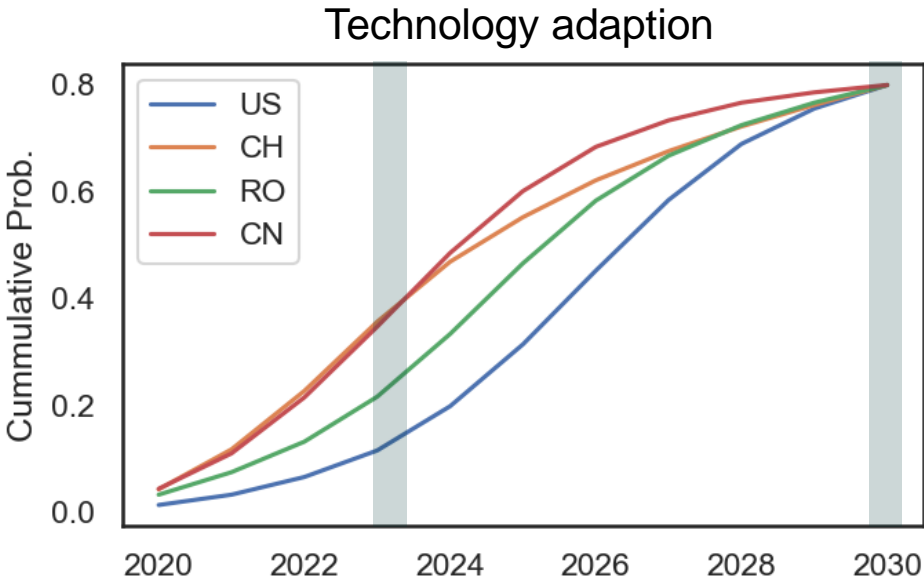
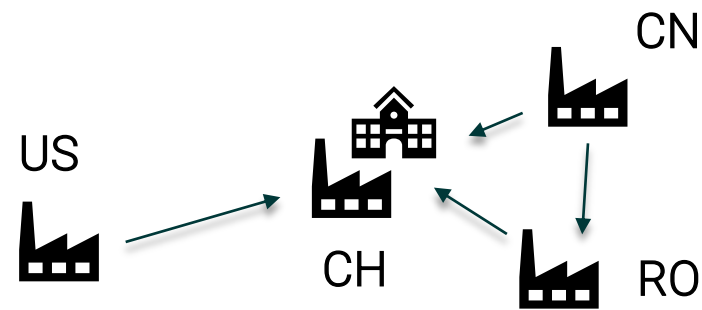
- $p(\text{history})$

- $p(\dots)$

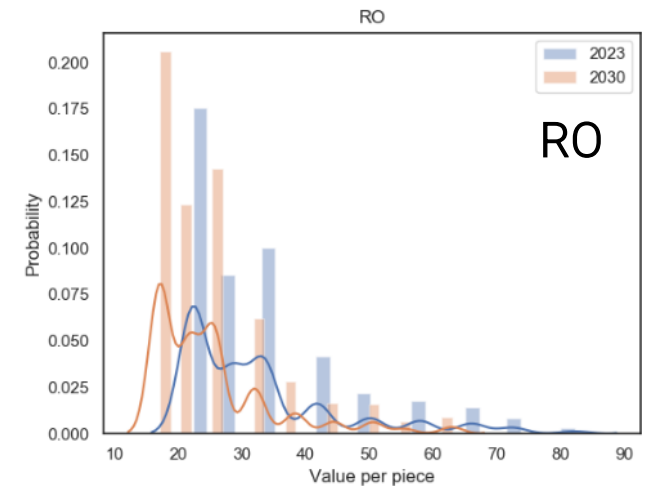
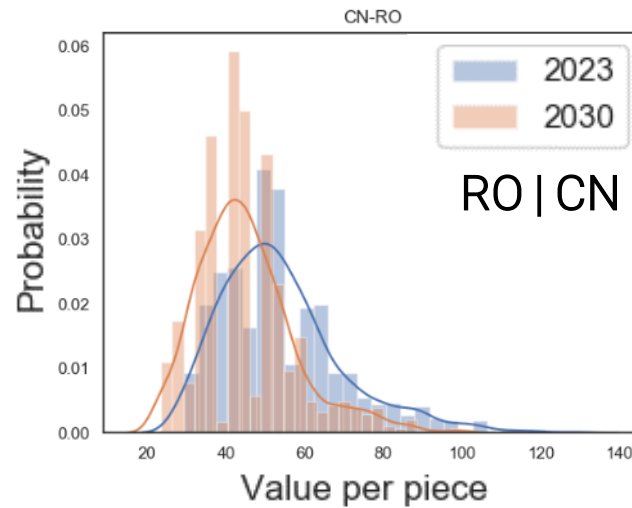
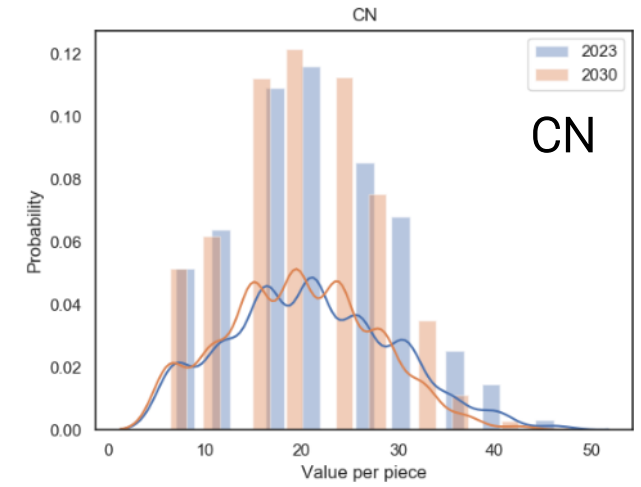
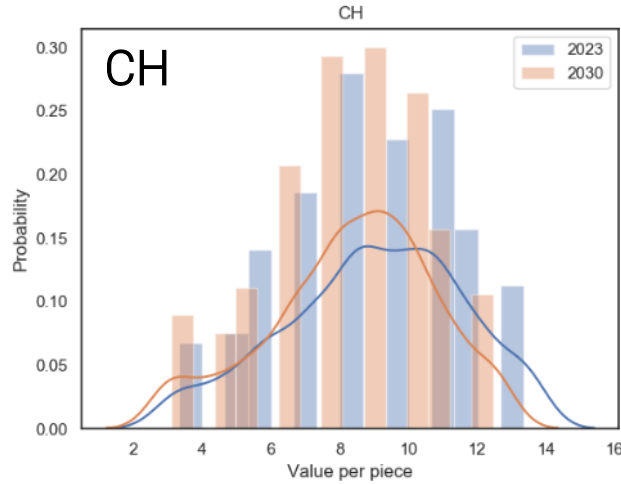
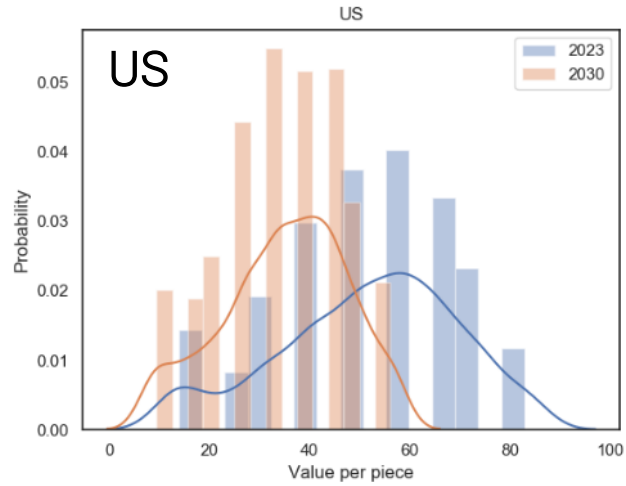
} Known or set

} Estimate distributions

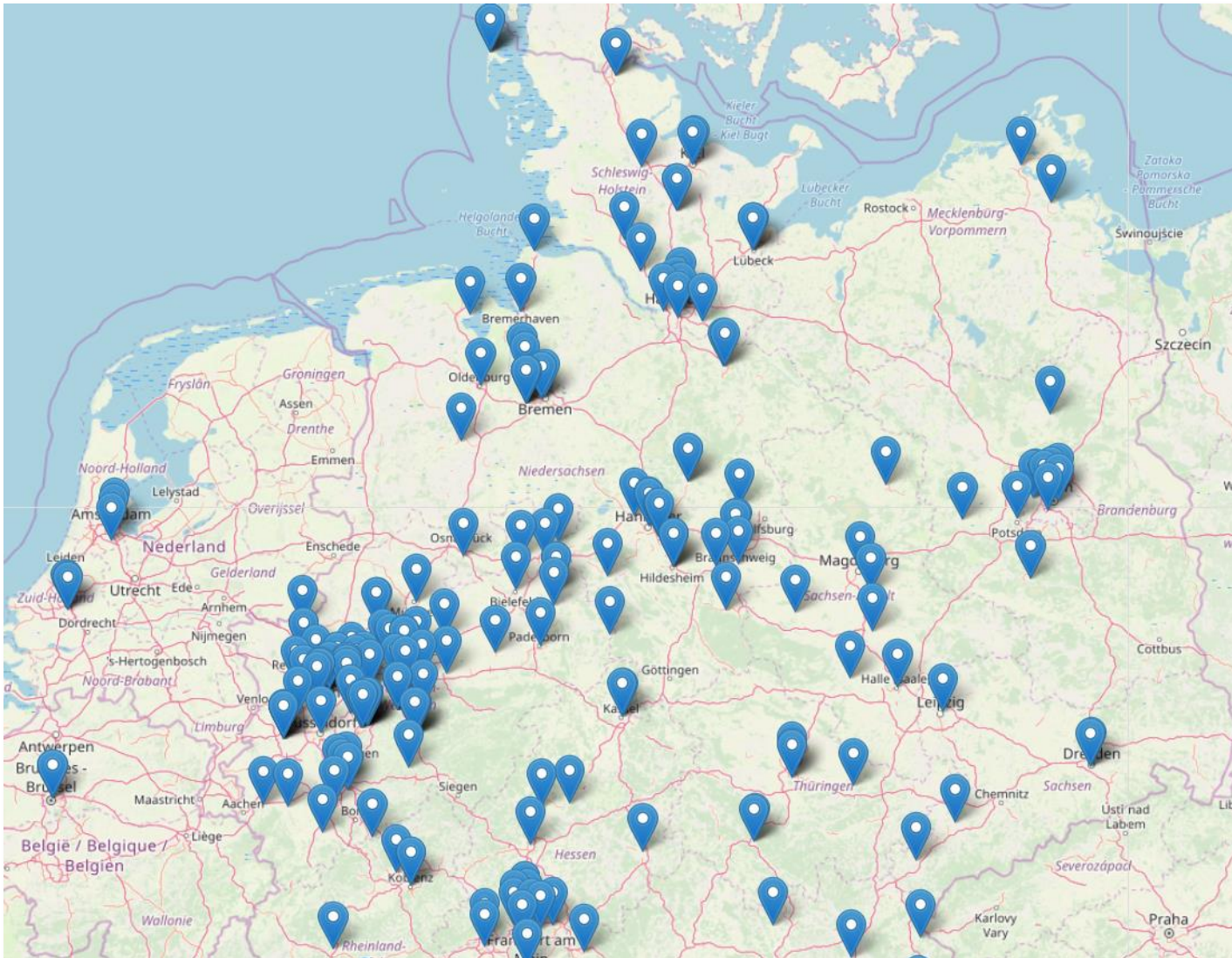
Probability distributions of the Sustainable Development scenario



Result: tech adaption keeps cost under control

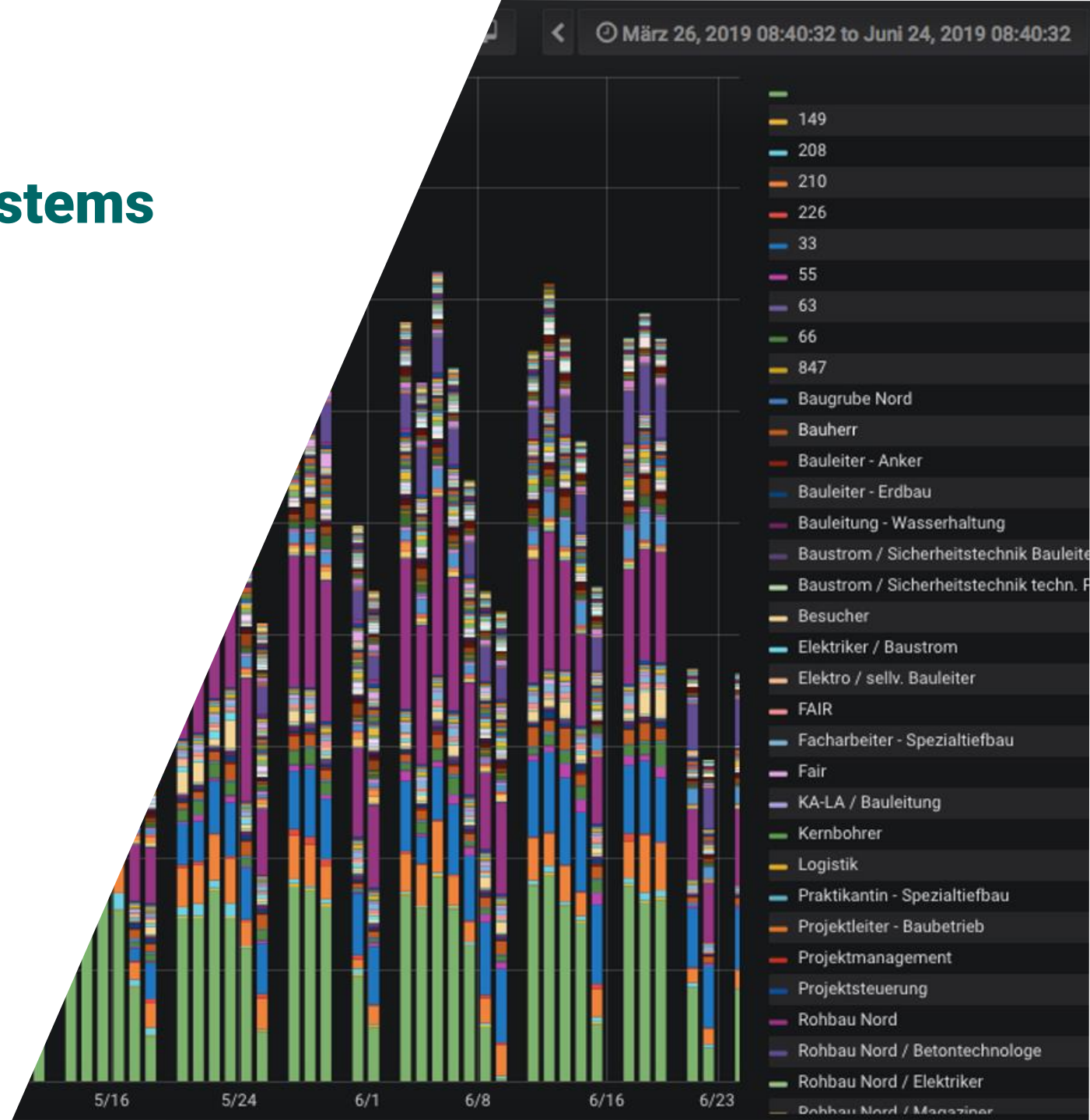
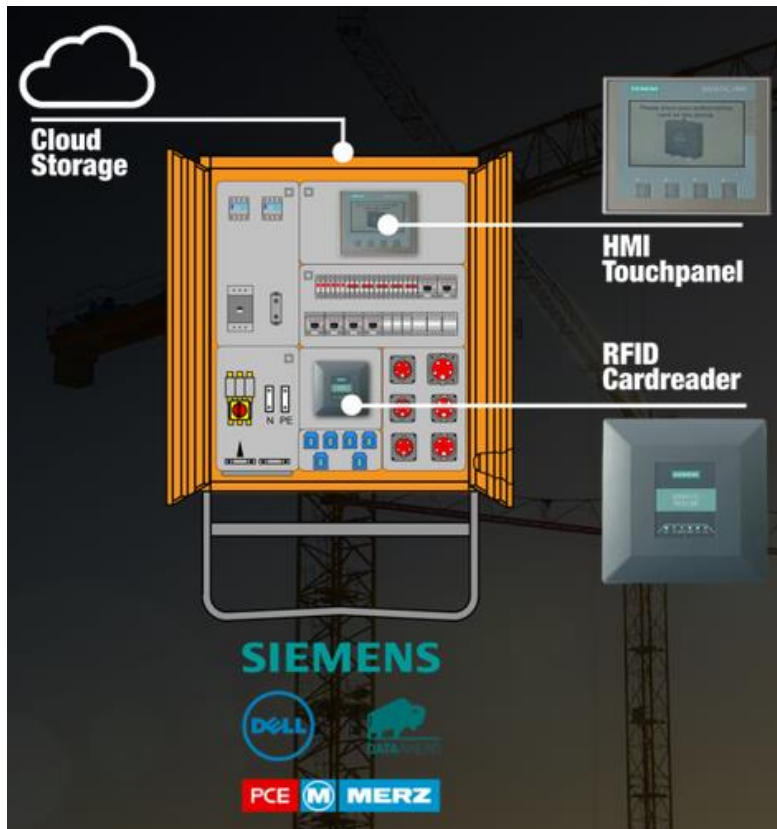


Real estate portfolio analysis



- **Power CO2 cost**
Cost of electricity-based emissions using probabilistic power supply and demand model
- **Heating OPEX cost**
Fuel cost scenarios
- **Heating CO2 cost**
Heating-based emission cost using CO₂ price scenario and consumption models
- **Sea level rise**
Annual mitigation cost of buildings
- **Heat wave days**
Probabilistic heat-wave related cost model derived from climate models
- **Storm damage**
Probabilistic model for extreme storm events

Limitation: Enterprise data systems



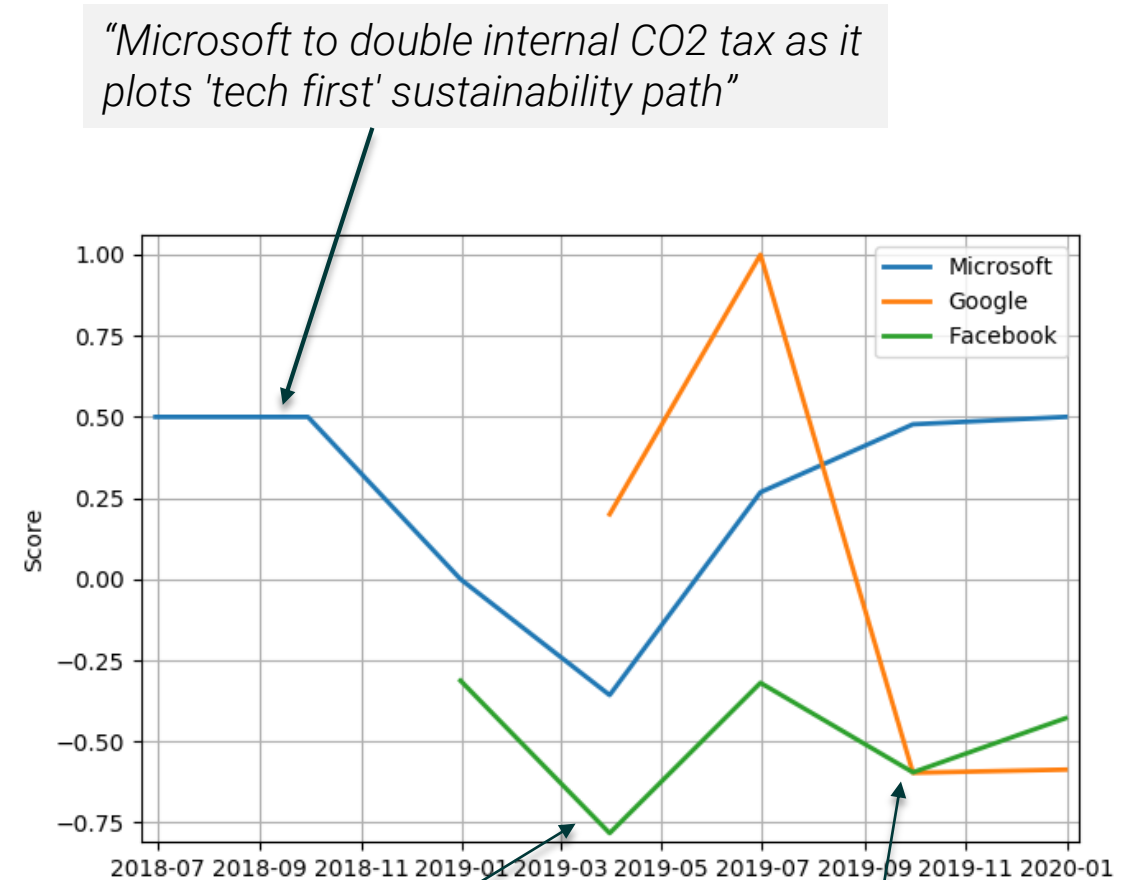
NLP based resilience assessment based on historic data

Historic data with future reach:

- Patent applications
- M&A
- *Media news*

Process:

1. Define use case: "Climate-related company resilience score"
2. Choose tool: "Sentiment scoring tuned to climate resilience"
3. Select data: Any news aggregator of your trust



"Google, Facebook and Microsoft were the top sponsors of a conference that featured climate change denial kooks"

"Facebook and Tesla accused of hiding climate change risks"



The essence: Points-of-truth data beat aggregations and estimations

Use machine learning for improving what you know and inferring signal from complexity

- Data augmentation (e.g., matrix factorization)
- Scenario analysis (e.g., probabilistic graphs)





Thank you for your interest!

Christian Spindler

+41 79 875 9243

cspindler@dataaheadanalytics.ch

DATA AHEAD ANALYTICS GmbH
Technopark
8005 Zürich
Switzerland

+41 79 875 9243

info@dataaheadanalytics.ch

dataaheadanalytics.ch

