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Institute of Computer Science



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Real-Time & Streaming AutoML for Industry

How AwareML Makes AI Transparent, Controllable &
Sustainable for Your Business

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Data Systems Group

Seminar: AI and Human-Centered Technologies in Industry 

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Your Business Runs on Live Data. Is Your AI Keeping Up?



Machines Fail Unexpectedly

Reactive maintenance costs **3-4x more** than predictive strategies. Downtime kills productivity.



Models Go Stale

Yesterday's AI model doesn't know today's reality. Data drifts, and static models degrade silently.



AI Decisions are a "Black Box"

If managers can't explain *why* an AI made a decision, they won't trust or adopt it.



THE COST OF INACTION

€260k
per hour

Average cost of unplanned downtime in the automotive manufacturing sector.





Think of it this way:

Traditional ML is like hiring a specialist to manually tune an engine.

AutoML is an intelligent system that does the specialist's job automatically, 24/7.



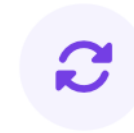
Algorithm Selection

Automatically tests and finds the best algorithm for your specific data patterns.



Hyperparameter Tuning

Fine-tunes complex model settings that usually require hours of expert time.



Adaptive Rebuilding

Detects changes in data and retrains models instantly to maintain accuracy.

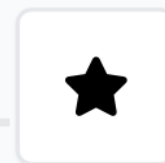
THE WORKFLOW



Raw Data



AutoML Engine



Best Model



Business Prediction

What is Concept Drift?

In plain words: customer behavior, production processes, and market environments change over time.

⚠ The Problem: A model trained on January data may fail completely by June if it doesn't adapt.



Energy Demand
Shifts seasonally & daily



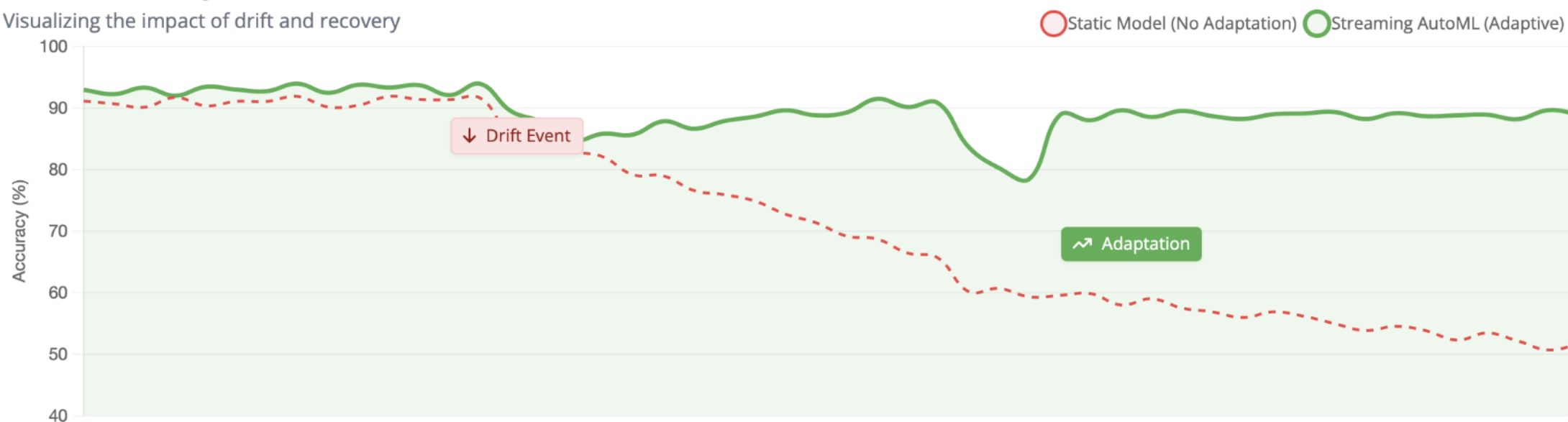
Production Defects
Change with raw materials



Customer Behavior
Evolves with market trends

Model Accuracy Over Time

Visualizing the impact of drift and recovery





A unified platform integrating **5 state-of-the-art frameworks** to deliver full visibility and control over your streaming AI.



Controllable

You set the rules. Define algorithms, time budgets, and optimization goals (e.g., accuracy vs. energy) before execution.



Transparent

No more black boxes. See exactly **why** the AI made every decision with integrated SHAP explanations.



Fair

Monitor algorithmic fairness in real-time. Ensure your model treats all demographic groups equally over time.



Sustainable

Track the environmental cost. Measure energy consumption (kWh) and CO₂ emissions for every model run.



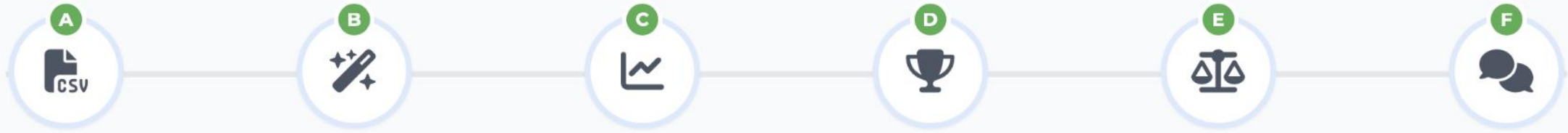
<https://github.com/DataSystemsGroupUT/AwareML>



FROM DATA TO PREDICTIONS

The 6-Stage AwareML Pipeline

Real-Time & Streaming AutoML



CONTEXT SETUP

Upload data, set time budgets, and select algorithms. Define your constraints upfront.

SMART REC.

AI analyzes your goals (e.g., "low energy") and recommends the best framework.

LIVE TRACKING

Watch the model adapt to data drift in real-time. Visualize accuracy drops and recovery.

OUTCOME RANKING

Compare frameworks side-by-side. See trade-offs between accuracy, speed, and CO₂.

FAIRNESS & XAI

Audit algorithmic fairness (parity) and generate SHAP explanations for decisions.

ASK THE AI

Chat with the integrated LLM assistant to get plain-language insights about your data.

i This pipeline ensures a structured, compliant, and transparent path from raw streams to business value.



Tell AwareML your goal, and it selects the optimal framework.



Mode 1: Natural Language

Type your requirement:

"I need a setup for a low-energy edge deployment with strong performance."

Analyzing...



Mode 2: Metric Selection

Select optimization priorities:

Energy

Speed

CO₂

Accuracy



RECOMMENDED FRAMEWORK

AutoStreamML

Best match for **Low Energy** and **Sustainability** goals.

73.28%
CONFIDENCE SCORE

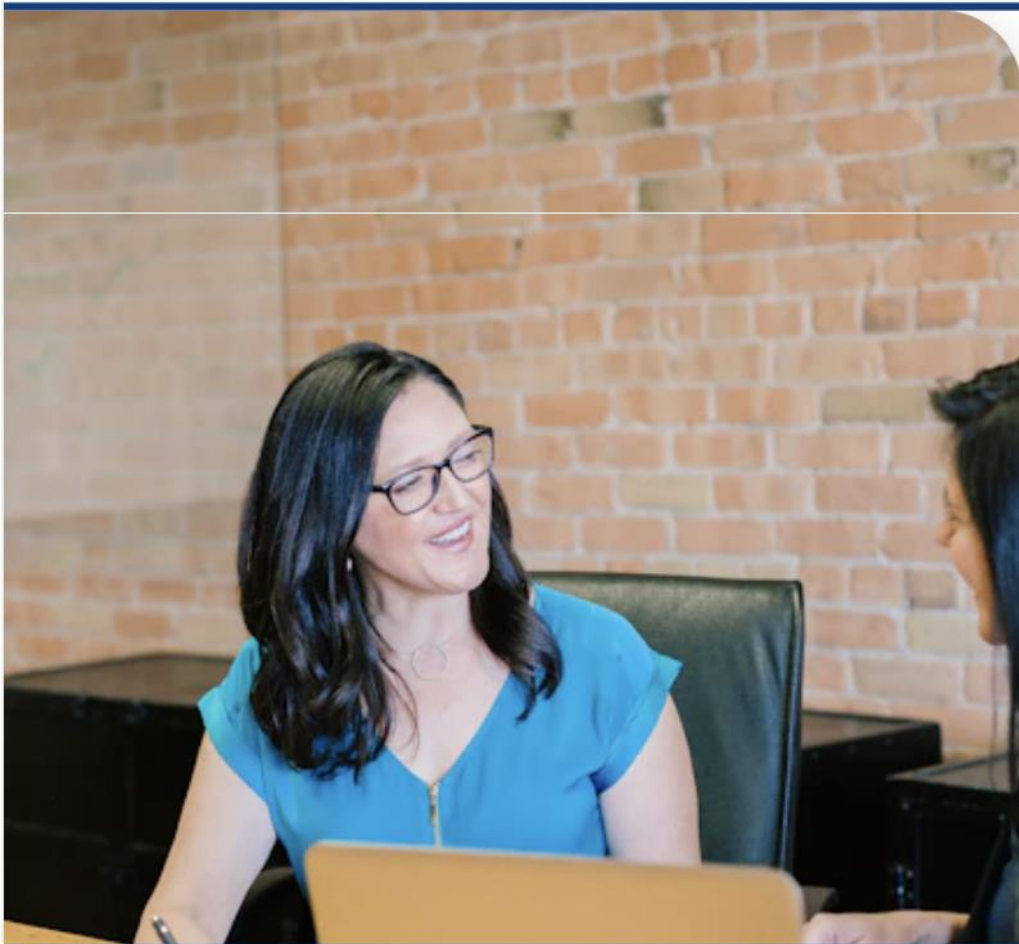
84%
META-MODEL ACCURACY



CASE STUDY

Predicting Workforce Income in Real-Time

Real-Time & Streaming AutoML



Business Context

An HR analytics platform continuously scores incoming employee profiles. The model must adapt as demographics and job market conditions shift in real-time.

UCI Adult Dataset (Census Income)

48,842

RECORDS

14

FEATURES

Binary

TARGET (>\$50K)

Key Features:

Age

Education

Occupation

Hours/Week

Marital Status

Relationship

Experimental Setup

● Streaming Configuration

 Time Budget: 60s

 Window Size: 500

 Fairness Attribute: Sex (M/F)

● Frameworks Benchmarked

Compared AutoStreamML against industry baselines: AutoClass, EvoAutoML, OAML, and ChaCha.



CASE STUDY RESULTS

Live Performance Under Concept Drift

Real-Time & Streaming AutoML

ACCURACY

88.14%

↑ Top-1

vs. Benchmark

TOTAL RUNTIME

770s

Processing ~35k

Instances

ENERGY CONS.

0.013 kWh

Ultra Low

Edge Ready

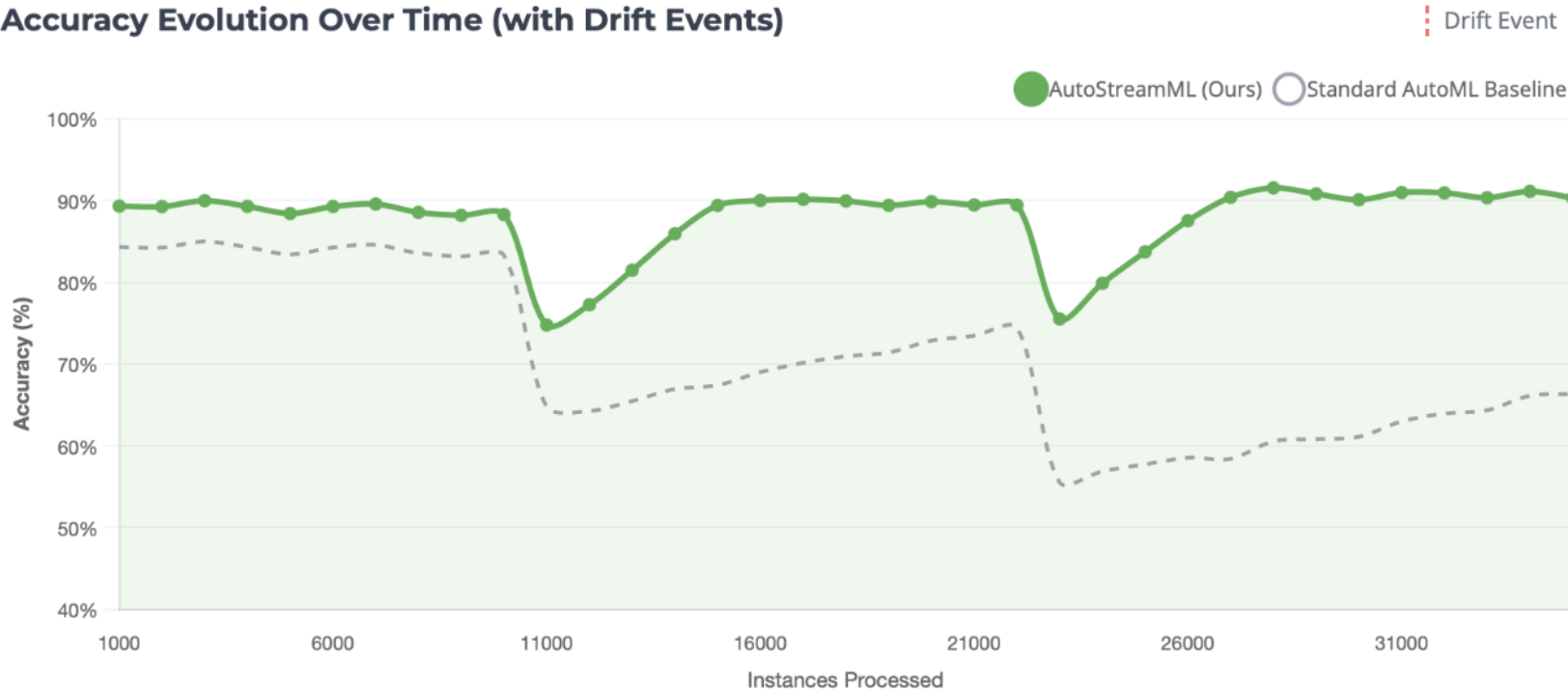
CO₂ EMISSIONS

5,352 µg

Minimal

Footprint

Accuracy Evolution Over Time (with Drift Events)



Key Insight

AutoStreamML (Green Line) recovers sharpest after drift events compared to static baselines.

- ✓ Best Accuracy
- ✓ Lowest Environmental Cost

DRIFT RECOVERY SPEED

▶▶ **2x Faster**

than standard retraining



FAIRNESS MONITORING

Does the AI Treat Everyone Equally?

Real-Time & Streaming AutoML



Metric: Demographic Statistical Parity (DDSP)

We measure whether sensitive groups (e.g., Male vs. Female) receive positive predictions at similar rates. In streaming, we track this **continuously over time** to detect if drift introduces bias.

EU AI Act Ready

Continuous monitoring is essential for compliance with high-risk AI regulations and GDPR non-discrimination requirements.

FRAMEWORK	FAIRNESS STABILITY	BEHAVIOR UNDER CONCEPT DRIFT	RESULT
AutoStreamML	Most Stable	Maintains consistent parity even after sudden data shifts. Minimal bias fluctuation.	
AutoClass	Moderate	Shows minor fluctuations in fairness metrics when adapting to new concepts.	—
EvoAutoML	Fluctuates	Evolutionary adaptation sometimes sacrifices fairness for short-term accuracy gains.	—
ChaCha	High Fluctuation	Largest parity swings observed. High risk of temporary bias during model updates.	✗

* Analysis based on 'Sex' attribute (Male/Female) in Adult dataset stream.



EXPLAINABILITY (SHAP)

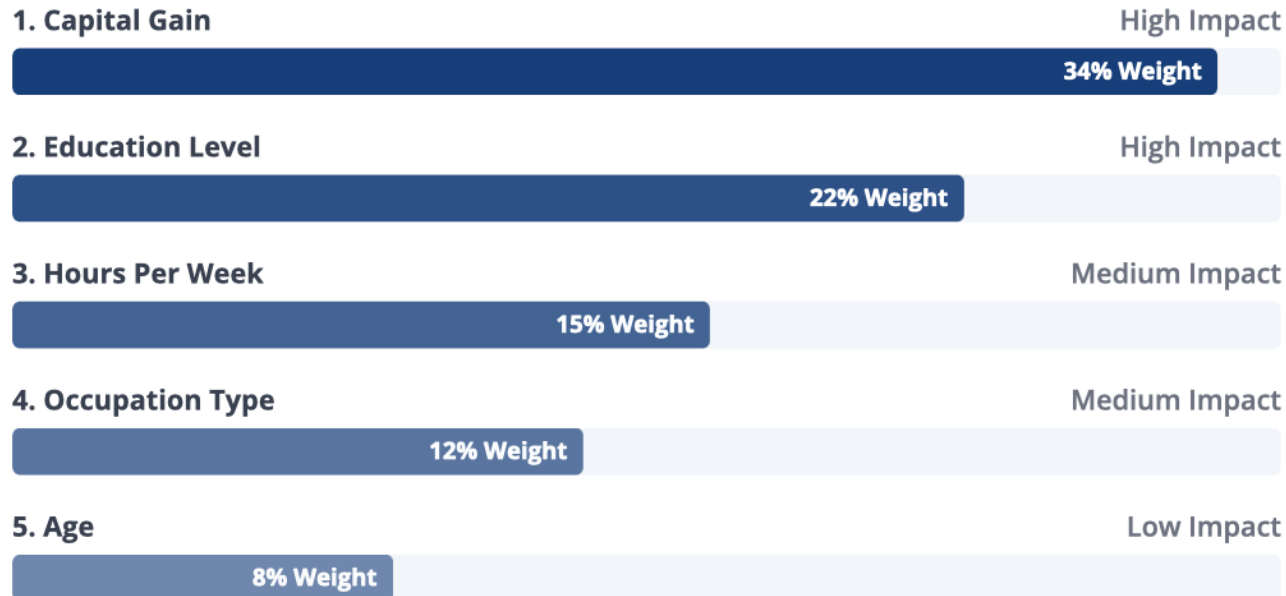
Why Did the AI Make That Decision?

? What is SHAP?

SHAP assigns a "blame score" to each data point. It shows exactly which factors (features) pushed the AI's prediction up or down, making the "Black Box" transparent.

Top 5 Features Driving Predictions

AutoStreamML Model



EXPLANATION QUALITY METRICS

STABILITY
✓ High



CONSISTENCY
✓ High



SPARSITY
✓ Good



LLM Insight

"AutoStreamML provides reliable, repeatable explanations driven by a small set of informative features (like Capital Gain and Education) — making it ideal for real-time deployment where trust is critical."

Business Value

You can now EXPLAIN any AI decision to your manager, your auditor, and your customer with confidence.

AwareML Assistant
Online

Show me the most important features for AutoStreamML.



Here is the SHAP feature importance analysis for the current AutoStreamML model:



Insight: The top features driving income predictions are **Capital Gain**, **Education Level**, and **Hours Per Week**. These factors account for **67%** of the model's decision weight.

Ask a follow-up question...



Example Questions



"Why was this customer flagged as high risk?"

Get instant explanation for individual predictions



"Has performance dropped in the last 1,000 records?"

Check real-time model health checks



"Which features changed most after the last drift?"

Understand concept drift impact

No PhD Required

AwareML Speaks Your Language

You don't need a data science degree to understand your AI. The built-in LLM translates complex model metrics into clear business insights.



SUSTAINABILITY METRICS

Green AI for Responsible Business

Real-Time & Streaming AutoML

ENERGY CONSUMPTION

0.013 kWh

✓ Extremely Low



CO₂ EMISSIONS

5,352 µg

✓ Minimal



RUNTIME BUDGET

60 sec

🔒 Strict Limit



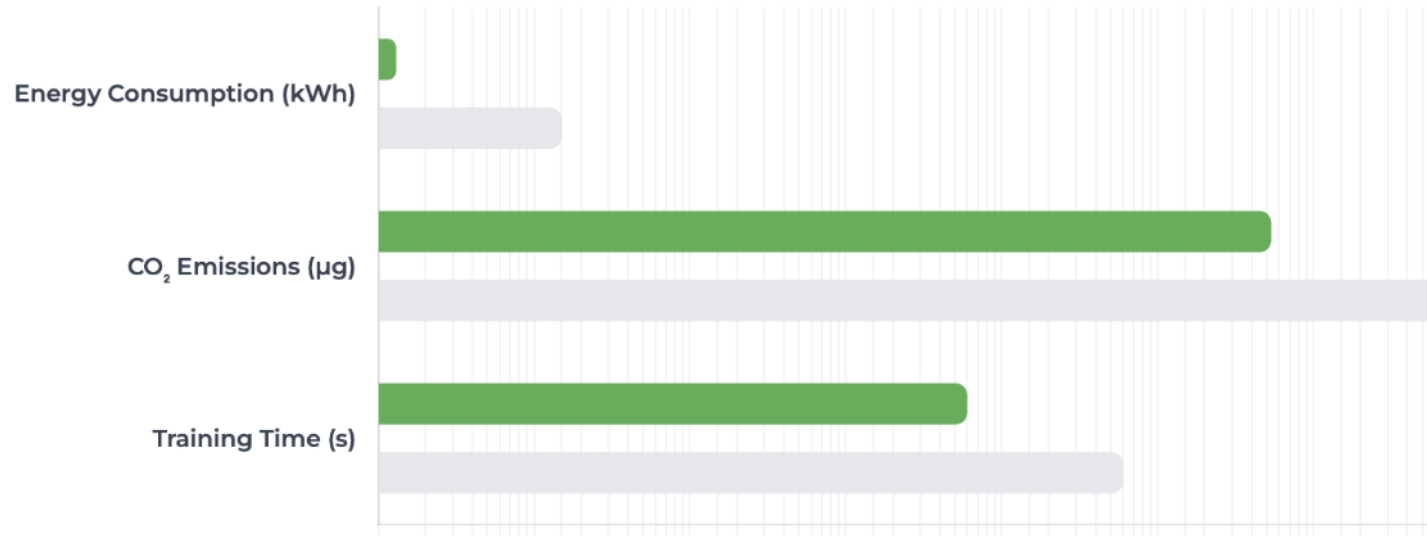
EQUIVALENT TO



~5 mins

Resource Footprint Comparison

■ AwareML ■ Traditional AutoML



Logarithmic Scale (Lower is Better)



Regulatory Ready



EU Green Deal & CSRD

New directives push companies to measure their digital carbon footprint. AwareML tracks and reports this automatically.

- ✓ Audit-Ready Logs
- ✓ Transparent Reporting



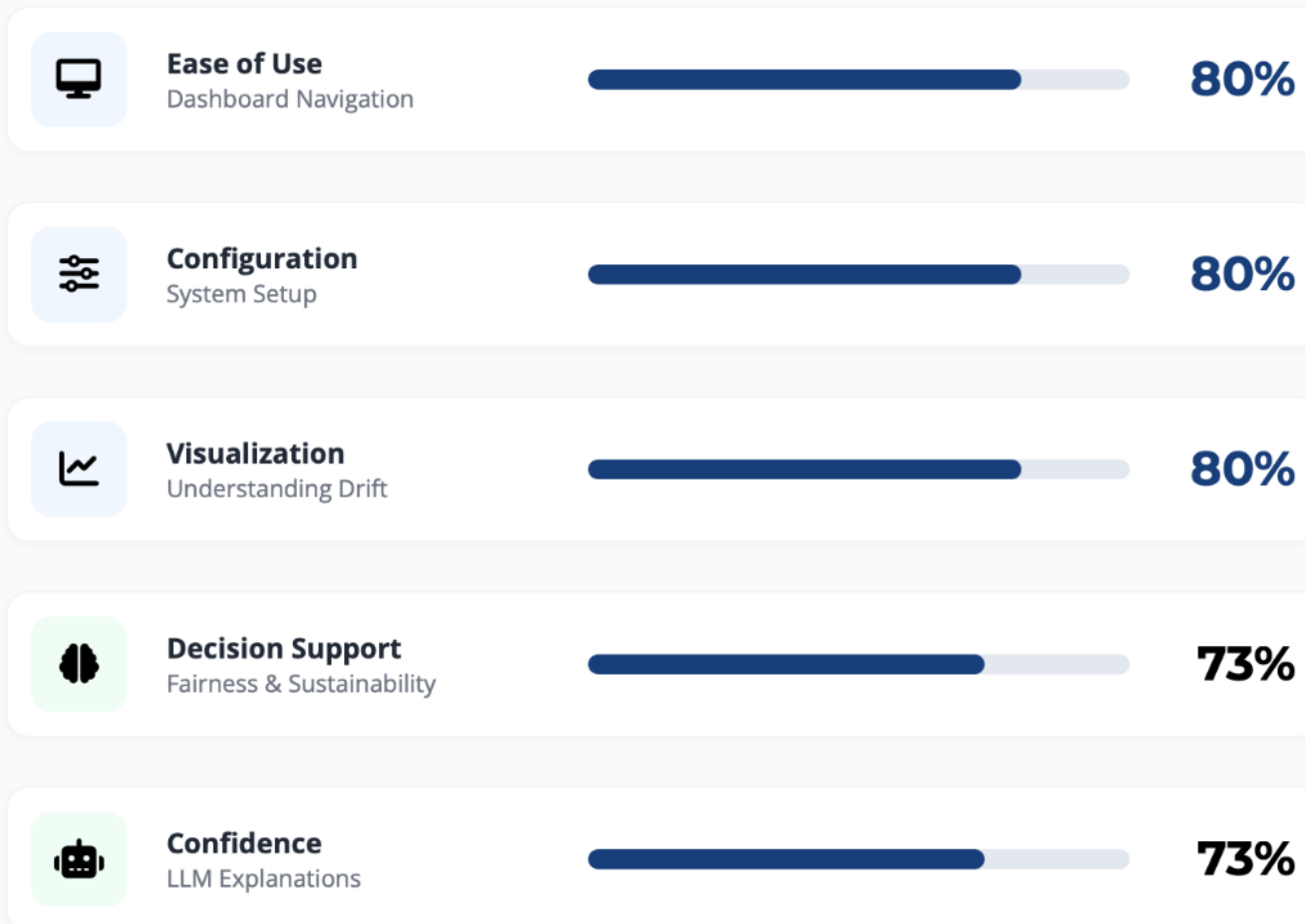
USABILITY RESULTS

Tested and Validated by Industry Users

Real-Time & Streaming AutoML

Key Findings

👤 n=15 Participants



STUDY METHODOLOGY

- ✓ 15 Industry Participants
- ✓ Likert-Scale Evaluation

You don't need to be an AI expert to use AwareML — that's the whole point.



Study Participant
Industry Engineer



BUSINESS VALUE

From Research to Your Factory Floor

Real-Time & Streaming AutoML

⚠️ INDUSTRY CHALLENGE



🧠 AWAREML SOLUTION



🏆 BUSINESS BENEFIT



Model Degradation

Accuracy drops over time



Streaming AutoML

Adapts continuously



Reduced Maintenance

Fewer manual retrains



Black-Box AI

Decisions are untrusted



SHAP + LLM

Plain language insights



Trust & Adoption

Stakeholder confidence



Fairness Risk

Potential legal liability



DDSP Monitoring

Continuous auditing



Compliance Ready

EU AI Act & GDPR



Hidden Energy Cost

Unknown footprint



CO₂ & Energy Tracking

Built-in metrics



Sustainability Reporting

CSRD / ESG Data



Complexity

Choosing AI is hard



Meta-Recommender

AI selects the best setup



Faster Deployment

Goal-aligned startup



ROI Takeaway

AwareML turns technical complexity into measurable business value.





GET STARTED

Try AwareML Today — 3 Simple Steps

Real-Time & Streaming AutoML

1



Upload Data

Upload your streaming dataset in **CSV format**. AwareML works with data from any industry domain (energy, finance, manufacturing).

2



Describe Goal

Use **natural language** ("optimize for low energy") or manually select metrics like Accuracy, Speed, or CO₂ efficiency.

3



Explore Results

View the live dashboard. Monitor performance, audit **fairness**, analyze **explainability**, and track sustainability.



Access AwareML

Open source and ready to demo.



CODE

[AwareML](#)



DEMO

[AwareML Demo](#)



Let's Pilot Together

We are actively looking for industry partners. We can pilot AwareML on **your company's data** to demonstrate value.

[Contact us to start](#) →



LET'S COLLABORATE

Connect with the Research Team

Real-Time & Streaming AutoML



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🗂 Data Systems Group



Data Systems Group

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🌐 bigdata.cs.ut.ee

WAYS WE CAN WORK TOGETHER



Joint R&D Projects

Collaborative research grants and innovation partnerships



Workshops & Training

Upskill your engineering team on AutoML & AI Ethics



Pilot Project

Test AwareML on your company's data today

Thank You

Questions?

We'd love to hear from you.

PRESENTED BY



Seminar

AI and Human-Centered Technologies in Industry

AwareML

Transparent, Controllable,
and **Sustainable** AI for Industry



Explore the Code

<https://github.com/DataSystemsGroup/UT/AwareML>



Watch the Demo

<https://streamable.com/nm5mkv>