Stop Guessing, Start Optimizing: How Decision-Focused Learning Makes HVAC Smarter and Cheaper

HVAC control matters: space heating = 2/3 of home energy!

- ? Did you know? Nearly two-thirds (64%) of all household energy in Europe goes to space heating—by far the largest single use.
- Fre Challenge: As homes switch from fossil fuels to electric heating and add solar panels or batteries, the power grid faces huge new peaks and complexity.
- **The Opportunity:** Smarter, more relevant control of Heating, Cooling and Air Conditioning (HVAC) to *save money* and turn every HVAC decision into a *grid-friendly action*, easing renewable integration.

Our Solution: Decision-Focused Learning (DFL) for HVAC Management System



- **1. Taks-agnostic learning**: Pre-train on historical data for a solid start.
- **2. Decision-focused learning**: Fine-tune by simulating real control decisions, updating the model to minimize real-world errors (i.e., *end-to-end learning*).
- **3. Hierarchical Loss**—Loss prioritizing building-wide accuracy, then floor, then zone and bypassing the need for differentiable simulator => *Works with black-box systems*

Realistic Test: 15-Zone Office, Denver, CO

Setup:

- 3-floor building office with 5 zones per floor, EnergyPlus simulation
- Time-of-use tariff day/night
- 10 representative days

Results:



- Two-Stage (2S): Training on historical data only (conventional approach)
- Decision-Focused Learning(DFL): The proposed approach

Energy bill reduced by 10%!
No more nasty billing surprises!
Computational time to be improved



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