



Energy Modelling Initiative

Bringing the Tools to Support Canada's Energy Transition

Electrification and deep decarbonization of Canada's energy system with small-scale residential prosumers: A case study of Ontario

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**POLYTECHNIQUE
MONTRÉAL**

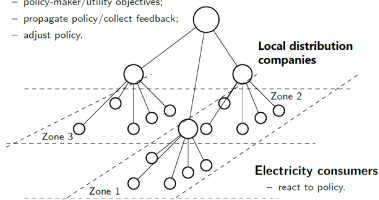
Content

- ▶ Policy-maker decision-support framework
- ▶ Household model
- ▶ Representation of a jurisdiction
- ▶ Framework application
- ▶ Model analysis and future developments

Policy-maker decision-support framework

Grid operator:

- policy-maker/utility objectives;
- propagate policy/collect feedback;
- adjust policy.



Energy system decarbonization and electrification objectives

Potential policy pathway for a selected long-term horizon:

- Tariffs
- Subsidies
- Renewable and storage operation schemes
- Other incentives (e.g., rebate)

Additional data

ABM decision-support model

Effects for a jurisdiction:

- RES installed capacities
- RES annual electricity generation
- Carbon savings
- Potential for disconnection
- Electricity affordability
- Policy cost

Additional inputs: maps of strategies evolution

Effects for potential sensitive locations:

- Design-making pattern of a typical household
- Optimal power dispatch in a household

Does the policy provide positive contributions in achieving global objectives?

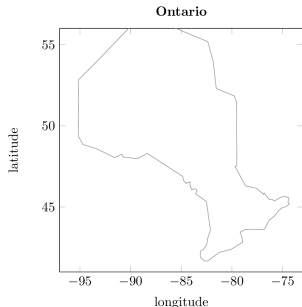
NO

YES

Policy pathway is short-listed for further analysis

Adjust policy pathway

► Application:



Household decision-support model

Current tariff policy and its future trend: variable rates, fixed charges, renewable and storage operation plans, other incentives

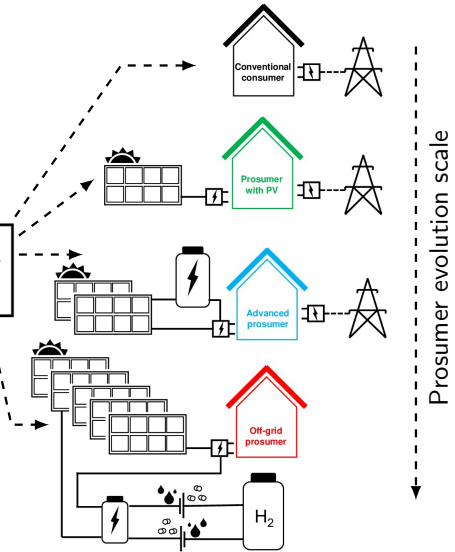
Technologies investment conditions and future costs trends

Technologies technical specifications

Environmental conditions in a household location: solar irradiation, ambient temperature

Operation conditions: household load profile

Household decision-support model



Household decision-support model

- ▶ Minimize Net Present Value of future cash flows (expenses)

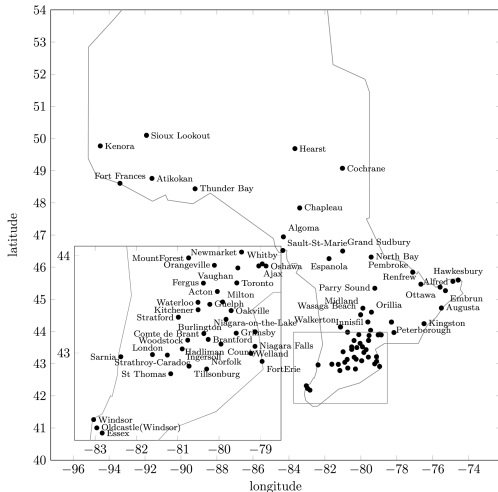
$$\sum_{y \in Y} \frac{[CAPEX_y + REPLACE_y + OPEX_y + Electricity\ Bill_y - Avoided\ cost_y]}{(1 + Discount\ rate)^{-y}}$$

s.t.

- $CAPEX_y$ - installed costs of PV and storage technologies
 - $OPEX_y$ - maintenance costs of PV and storage technologies
 - $REPLACE_y$ - replacement costs in case of PV and storage technologies fail outside their warranty period
 - $Electricity\ bill_y$ - electricity bill paid to the grid based on variable rates and fixed charges
 - $Avoided\ cost_y$ - avoided costs due to self-generation and self-consumption (avoided part of the electricity bill)
- ▶ Allows to simulate a progressive expansion of RES system
 - ▶ Integrates the model for optimal power dispatch in a household in presence of RES generators (here only PV), residential electric battery and seasonal storage based on power-to-H₂-to-power technology

Representation of a jurisdiction - Number of intelligent households' agents

- ▶ How many agents for a given jurisdiction?
- ▶ Must be representative of areas with
 - different tariffs
 - different environmental conditions
 - type of appliances used in a household (consumption patterns)
- ▶ For Ontario
 - 67 consumer agents representing 67 distribution areas
 - each agent is a typical household with average electricity consumption of 700 kWh/month

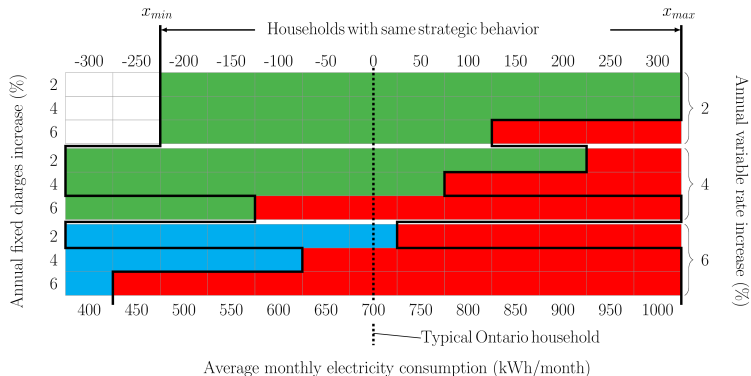


Representation of a jurisdiction - Households with the same strategic behavior

- How many households with the same strategic behavior in a given jurisdiction?

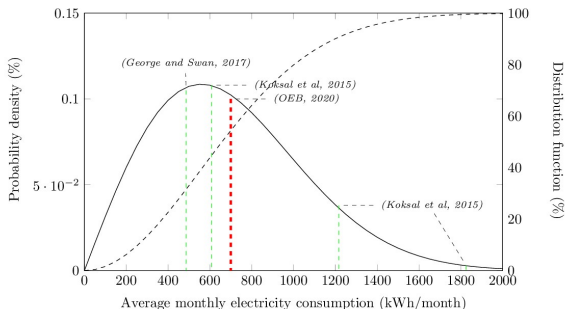
Strategic decisions of a household in Atikokan:

- Conventional consumer
- Prosumer with PV array
- Advanced prosumer with PV array and electric battery
- Off-grid prosumer with PV array, electric battery and seasonal storage



Representation of a jurisdiction - Households with the same strategic behavior

- How many households with the same strategic behavior in a given jurisdiction?



- For Ontario
 - No access to the consumption measurements
 - Rely on Weibull PDF (study of electricity use in detached houses in Sweden) and few available studies for Ontario
 - From the cumulative distribution function $F(x_{\min})$ and $F(x_{\max})$ - around 40% of households will have similar strategic behavior
 - 1,122,744 of single-detached households for all Ontario

Framework application - Step 1. Potential policy pathways

► Major assumptions:

- household under residential tariff plan
- natural gas heated household (the majority of Ontario households)
- bill structure remains unchanged over a planning period
- RES are connected under net metering
- electricity rates are at their pre pandemic level

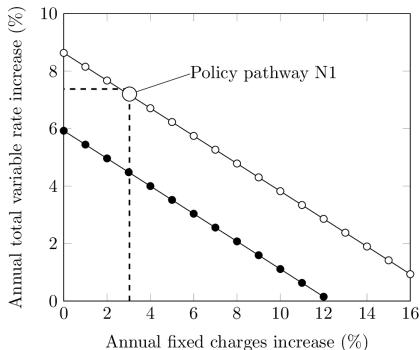
► Policy pathways refer here to economic and financial measures:

- total variable rate
- fixed service charges
- rebate

$$\begin{aligned} \text{Electricity bill} = & \left[\text{Consumption} \cdot \underbrace{(\text{Electricity rate} + \text{Transmission rate} + \text{Distribution rate})}_{\text{total variable rate}} \right. \\ & \left. + \text{Fixed service charges} - \text{Rebate} \right] + \text{Taxes} \end{aligned}$$

Framework application - Step 1. Potential policy pathways

► 2021-2050 planning horizon

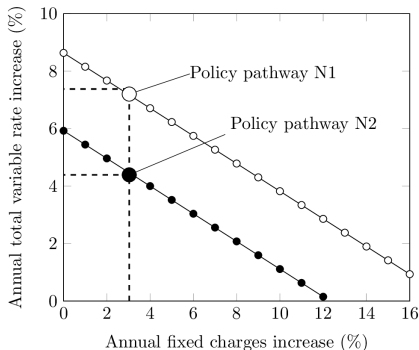


► Policy pathway N1 - Actual pricing with rebate:

- total bill increases without rebate by 5.5% annually
- annual tariff increases: by 3% for fixed charges & by 7.19% for total variable rate
- rebate at least 21.2% of the total bill, 2% of annual increase, 5 years duration

Framework application - Step 1. Potential policy pathways

► 2021-2050 planning horizon



► Policy pathway N1 - Actual pricing with rebate:

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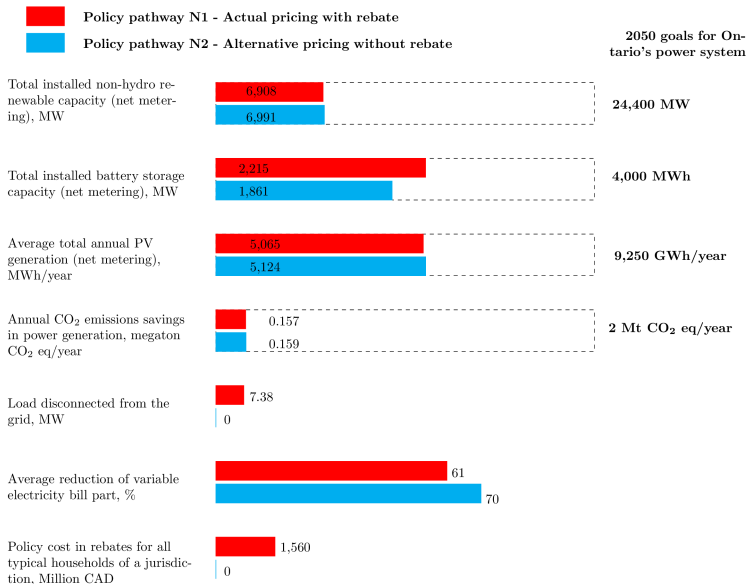
► Policy pathway N2 - Alternative pricing without rebate:

- total bill increases by 4% annually
- annual tariff increases: by 3% for fixed charges & by 4.48% for total variable rate
- no rebate

Framework application - Step 2. Data collection

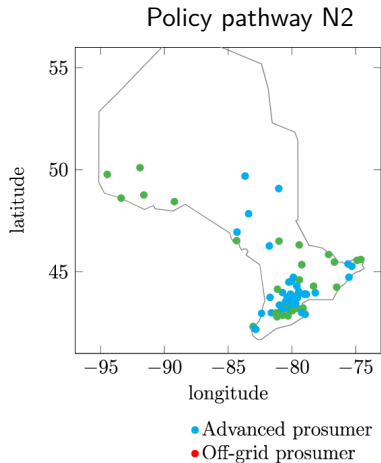
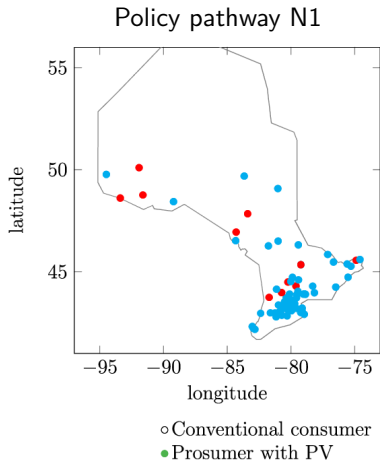
- ▶ All data is taken from available online sources:
 - OEB, IESO, local distribution companies
 - Government of Canada, Government of Ontario
 - Research councils, institutes and agencies: NRC, NREL, IRENA
 - Technology manufacturers and distributors, experts
 - Media and resources focused on green tech: Energy Sage, Energy Hub, GTM
 - Weather datasets: Weatherstats, CERES
 - Scientific publications in specialized journals
- ▶ Operational conditions (modeling toolboxes):
 - ▶ Mathematical model of PV array accounting for the technical characteristics of the panels, the solar irradiation and the loss of module efficiency with the increase of ambient temperature
 - ▶ Household load profile is simulated with a top-down approach, based on detailed chronological collection of overall electricity demand over a year

Framework application - Step 3. Global effects for Ontario



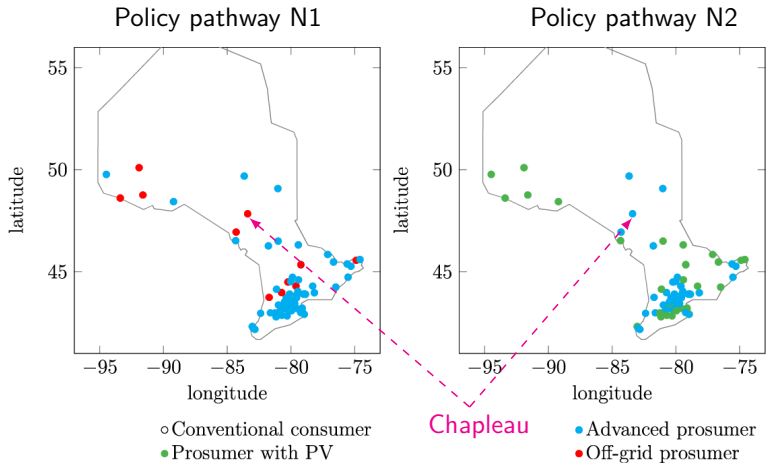
Framework application - Step 3. Global effects for Ontario

- Consumption strategies of Ontario's households illustrated for the year 2050



Framework application - Step 3. Global effects for Ontario

- Consumption strategies of Ontario's households illustrated for the year 2050



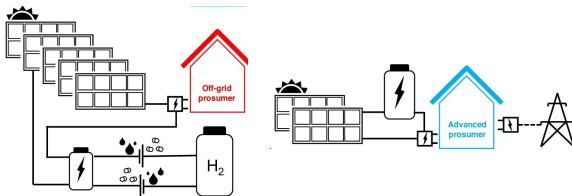
Framework application - Step 4. Effects for sensitive location

- ▶ Policy pathway N1 - Actual policy with rebate - Chapleau township

Framework application - Step 4. Effects for sensitive location

- ▶ Policy pathway N2 - Alternative policy without rebate - Chapleau township

Framework application - Step 4. Effects for sensitive location



Details	Policy pathway n1 - Actual pricing with re- bate	Policy pathway n2 - Alternative pricing without rebate
Prosumer total cash flows over 2021-2050 period		
Electricity bill, 10 ³ CAD	10.64 (8 years)	38.5
Investments, 10 ³ CAD	102.76 ¹	27.49 ¹
Avoided costs, 10 ³	75.9 ²	22.3
Balance, 10³ CAD	37.5	43.7
Benchmark - conventional consumer over 2021-2050 period		
Electricity bill, 10³ CAD	120.56	83.6

¹ Installed, maintenance and replacement costs.

² Including rebates.

Framework application - Step 5. Policies implication

► Implications of policies N1 & N2:

- Both policies may contribute to the global energy system goals
- System reliability - policy N1 may stimulate physical disconnection of prosumers
- Policy cost - policy N1 requires important investment for rebates

► Potential policy directions:

- To explore measures to mitigate the total bill increase, to help distribution companies diversify their service offers, to develop new business models to stimulate the local RES and storage markets, and to involve prosumers in demand response
- To rethink the use of power-to-H₂-to-power storage - may be included in low-carbon hydrogen strategy
- To reconsider the definition of "typical" household for policy effect evaluation - households with different monthly consumption react differently to policies

Model analysis and future developments

- ▶ Model features:
 - Applicable to different jurisdictions (size and location)
 - Model inputs may be defined "manually" or come from other models
 - Deterministic, no uncertainty related to future conditions variability, emergence of new technologies or other events
 - Accounts only for PV model (for Ontario case), but other technologies (such as wind power) may be also included
- ▶ Future developments
 - Scientific communications (Energy Modelling Platform for North America (EMP-NA) - Open Modelling Projects, a special issue of Energy Strategy Reviews)
 - Model licensing and technology transfer (looking for collaborative opportunities with policy-makers)
 - Model and algorithm improvements (automatic policy search with deep reinforcement learning, development of user interface)

Thank you!