



Limitations of optimization models for long-term planning - representing market designs, policy interventions and agent behavior

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Long-term energy-system or power-system optimization models: two perspectives

🌿 E.g., MARKAL/TIMES, ReEDS, etc.

🌿 Social perspective:

- ✂ Normative/prescriptive
- ✂ Maximize welfare/minimize cost

🌿 Private agents' perspective

- ✂ Descriptive
- ✂ Maximize total surplus/minimize cost
- ✂ Market equilibrium

Research question

What are the limitations of optimization models in representing the market equilibrium?

- ✦ Policy interventions
- ✦ Market designs
- ✦ Agent behavior

Optimization models - what can be done

Optimization Problem

$$\begin{aligned} \min_{cap_i, gen_{i,t}} \quad & \sum_t \sum_i \left(cap_i FC_i + \sum_t (gen_{i,t} MC_i \Delta_t) \right) \\ \text{s.t.} \quad & cap_i - gen_{i,t} \geq 0 \quad (\gamma_{i,t}) \quad \forall i, t \\ & gen_{i,t} \geq 0 \quad \forall i, t \\ & cap_i \geq 0 \quad \forall i \\ & \sum_i gen_{i,t} \Delta_t = q_t \Delta_t \quad (p_t^{el}) \quad \forall t \end{aligned}$$

KKT Conditions

$$p_t^{el} \Delta_t \leq MC_{i,t} \Delta_t + \gamma_{i,t} \quad \perp \quad gen_{i,t} \geq 0$$

$$\sum_t (\gamma_{i,t}) \leq FC_i \quad \perp \quad cap_i \geq 0$$

$$cap_i - gen_{i,t} \geq 0 \quad \perp \quad \gamma_{i,t} \geq 0$$

$$\sum_i gen_{i,t} \Delta_t = q_t \Delta_t$$

Only generate electricity if the price for electricity covers variable costs

Only invest if infra-marginal rents cover fixed costs

Infra-marginal rents can only be positive when generating at rated capacity

Optimization models - what can be done

Optimization Problem

$$\begin{aligned}
 \min_{cap_i, gen_{i,t}} \quad & \sum_t \sum_i \left(cap_i FC_i + \sum_t (gen_{i,t} MC_i \Delta_t) - \sum_t (gen_{i,t} S_i \Delta_t) \right) \\
 s.t. \quad & cap_i - gen_{i,t} \geq 0 \quad (\gamma_{i,t}) \quad \forall i, t \\
 & gen_{i,t} \geq 0 \quad \forall i, t \\
 & cap_i \geq 0 \quad \forall i \\
 & \sum_i gen_{i,t} \Delta_t = q_t \Delta_t \quad (p_t^{el}) \quad \forall t
 \end{aligned}$$

KKT Conditions

$$p_t^{el} \Delta_t + S_i \Delta_t \leq MC_{i,t} \Delta_t + \gamma_{i,t} \quad \perp \quad gen_{i,t} \geq 0$$

$$\sum_t (\gamma_{i,t}) \leq FC_i \quad \perp \quad cap_i \geq 0$$

$$cap_i - gen_{i,t} \geq 0 \quad \perp \quad \gamma_{i,t} \geq 0$$

$$\sum_i gen_{i,t} \Delta_t = q_t \Delta_t$$

Only generate electricity if the price for electricity + feed-in premium covers variable costs

Only invest if infra-marginal rents cover fixed costs

Infra-marginal rents can only be positive when generating at rated capacity

Optimization models - what can be done

Policy interventions

- RES support schemes: e.g., feed-in premium
- Carbon tax
- Technology acceptance
- Etc.

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Market design/imperfections

- Capacity payment, capacity market
- Emission trading markets, green certificate markets
- Non-level playing field: eligibility criteria, product definition, market access
- Incomplete markets: e.g., zonal pricing
- Etc.

Agent behavior

- Rational, perfect information (risk neutral), price-takers

Optimization models - what cannot be done

Policy interventions

- RES support schemes: e.g., feed-in tariff, minimum price for green certificates
- Grandfathering of emission allowances

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Market design/imperfections

- Net metering
- Average price contracts

Agent behavior

- Strategic behavior
- Risk-averse behavior
- Heterogeneous costs of capital (hurdle rate)

Duality

Role of linking constraints in optimization models

- ✂ Enforce physical/political constraints
- ✂ Represent markets (dual variable reflects the price)

Examples:

- ✂ Supply-demand balance: $\sum_i gen_{i,t} = q_t(p_t^{el}) \quad \forall t$

Implication: no decoupling possible between the physical/political constraint and the corresponding market

- ✂ All variables appearing in physical/political constraints valued according to the dual variable of that constraint (+ a constant)
- ✂ Variables not appearing in a physical/political constraint cannot be valued according to the endogenously determined price

Optimization models - what cannot be done

Policy interventions

- RES support schemes: e.g., feed-in tariff, **minimum price for green certificates**
- Grandfathering of emission allowances

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Example: minimum price for green certificates

🌿 Suppliers have obligation

🌿 Generators can decide to sell their certificates:

✂ To the market (suppliers): $q_i^{SUP} @ p^{GC}$

✂ To the DSO: at guaranteed minimum price: $q_i^{DSO} @ P^{GC,DSO}$

🌿 Issue: in an optimization model: every green certificate generated will be implicitly valued at the market price

$$\sum_i \sum_t (q_i^{DSO} + q_i^{SUP}) \geq D^{GC} \quad (p^{GC})$$

Alternative models

Mixed Complementarity Problems (MCP)

- ✂ + more flexible
- ✂ - Computation time increases

Parametrized optimization problems (iteratively solving optimization problems)

- ✂ + Small barrier for implementation
- ✂ - Computation time, convergence

Dedicated solution techniques

- ✂ + reduce computation time
- ✂ - low flexibility

Optimization models – relevance of what cannot be done

Policy interventions

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Optimization models – relevance of what cannot be done

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Optimization models – relevance of what cannot be done

Policy interventions

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- Strategic behavior
- **Risk-averse behavior**
- **Heterogeneous costs of capital (hurdle rate)**

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Conclusions and further research

- ✦ Optimization models cannot distinguish between physical/political constraints and the corresponding markets
- ✦ Certain market designs, policy interventions and behavioral elements cannot be represented
- ✦ Particularly the impact of behavioral elements (heterogeneous cost of capital, risk averseness) deserves further attention in long-term optimization models