

# Satisfiability of elastic demand in the smart grid *as understood by P. Maillé*

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# Motivation

**Context:** consider a given area (say, small city) **producing** and **consuming** energy

## *Production*

- wind turbines
- solar panels

## *Consumption*

- users with different appliances

- **Energy can be bought** to cover the extra demand, **but** changes in the quantity bought are limited (ramp-up, ramp-down)
- Production as well as consumption are **not perfectly predictable**
- **Some demand can be delayed**

**Question:** is it possible to delay demand to buy less energy, but avoiding instability?

# The mathematical model

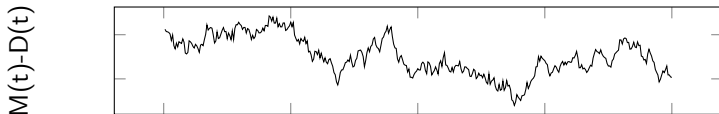
- Time is discretized, indexed by  $t$
- Actual “new” demand  $D^a(t)$  is not perfectly predictable

$$D^a(t) = \underbrace{D^f(t)}_{\text{forecast}} + \underbrace{D(t)}_{\text{random (due to weather...)}}$$

- Actual supply  $G^a(t)$  is not perfectly predictable

$$G^a(t) = \underbrace{G^f(t)}_{\text{forecast} = D^f(t) + r_0} + \underbrace{M(t)}_{\text{random (due to weather)}} + \underbrace{G(t-1)}_{\text{bought from outside}}$$

- $M(t) - D(t)$  is modeled as an ARIMA(0,1,0) (*discrete version of the Brownian motion*)



Time  $t$

# What happens if demand exceeds supply?

- The *frustrated* demand is backlogged and will be expressed later, **(being multiplied by  $1 - \underbrace{\mu}_{\text{"evaporation"} < 1}$  at each time slot)**
  - ▶ *Positive evaporation*: delayed demand decreases over time (ex: heating system)
  - ▶ *Negative evaporation*: delayed demand increases over time (ex: heat pump)

The detailed process:

$$\underbrace{E^a(t)}_{\text{Total expressed demand}} = \underbrace{D^a(t)}_{\text{new demand}} + \underbrace{\lambda}_{1/\lambda=\text{delay}} \underbrace{Z(t)}_{\text{latent backlogged demand}}$$
$$Z(t+1) = (1 - \mu)Z(t) + \underbrace{[E^a(t) - G^a(t)]^+}_{\text{frustrated demand}} - \lambda Z(t)$$

# Control policy

The **control variable**: what to buy from outside  $G(t)$

**BUT** limit

$\underbrace{-\xi \leq}_{\text{ramp-up constraint}}$

$$H(t) = G(t) - G(t-1)$$

$\underbrace{\leq \zeta}_{\text{ramp-down constraint}}$

for some  $\xi > 0$  and  $\zeta > 0$ .

**The policy considered: threshold-based control**

$$H(t) = \max(\min(\zeta, \underbrace{r^*}_{\text{"margin" objective}} - \underbrace{(G^a(t))}_{\text{supply}} - \underbrace{E^a(t)}_{\text{expressed demand}}, -\xi)$$

**Question tackled in the paper: does such a policy work?**

## Results

Once the **control policy** is fixed, the two-dimensional process describing

$$\left( \underbrace{G^a(t)}_{\text{supply}} - \underbrace{E^a(t)}_{\text{expressed demand}}, \underbrace{Z(t)}_{\text{backlogged demand}} \right) \text{ is a Markov chain}$$

(discrete-time, general state space)

### Theorem

*If  $\mu > 0$  (positive evaporation), the Markov chain is ergodic. For any initial distribution, the chain converges to its unique invariant probability measure.*

In words: the system is stable! (Backlogged demand does not explode if multiplied by  $1 - \mu < 1$  at each time slot)

### Theorem

*If  $\mu < 0$  (negative evaporation), the Markov chain is non-positive.*

In words: the system is unstable (Backlogged demand explodes if multiplied by  $1 - \mu > 1$  at each time slot)

See the 10-page long proof...

# Conclusions

- An interesting and rigorous model with
  - ▶ Energy production, consumption, and purchase
  - ▶ **Random parts** in demand and supply
  - ▶ Two types of impact of delayed demand (reduction or increase)
  - ▶ Control variable: **energy purchased**
- Some analytical results (stability, instability), but no so surprising

## Perspectives/extensions:

- Investigating other policies than the threshold-based one
- Applicability in other contexts (demand for content, instead of energy?)  $\Rightarrow$  cf Samantha's thesis with *delay-tolerant users*
- Complement the analysis by modeling the costs (of delay) and gains (in energy purchased) of such methods

Potential PhD candidates on those topics?