

# Photovoltaic Power installation in Wallonia: Estimating the rebound effect

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June 2018

First draft, not to be distributed

# Introduction

- Ambitious EU RES share objective → 2020 → 2030
- Implementation left to Member States
  - Feed-in-Tariff
  - Tradable Green Certificate
  - Net Metering
  - Capital Subsidies: Grant, Tax Rebate
  - Renewable Portfolio Standard
- Wallonia: generous incentives cover investment cost
- Focus on subsequent consumption behavior
- Is household elec. consumption rising after PV installation ?
- How much of the solar electricity is send back to the network ?
- Estimating rebound effect
- Country ability to swap “brown” electricity by “green” one
- Policy choice: citizen driven (decentralized) vs. market (centralized)

## Efficiency vs. Energy use

- New technologies: LED, isolation, electronics, smartphone
- Greater efficiency: need less electricity per unit of service
- Same total service with less total input
- Lower household energy use
- Key assumption: linear & direct (one-to-one)
- Khazzoom (1980) observes unintended consequences
- Apply today for home production of electricity:
  - appliance becomes economical, triggers acquisition
  - more disposable income to spend on gizmos
  - swap gas for electric heating
  - swap bus/train for electric car
  - leave lights on all night
  - run washing cycle during day instead of night
- Rebound Effect: true savings lesser than potential ones

# Rebound Effects

## • Direct

**Income** ↗ efficiency  $\Rightarrow$  marginal cost of electricity  $\searrow$  for user  
 $\Rightarrow$  ↗ electricity demand

**Substitution** ↗ efficiency  $\Rightarrow$  electricity cheaper vs. technologies  
 $\Rightarrow$  switch towards electricity driven technologies

## • Indirect

**Spillover**  $\searrow$  electricity cost  $\Rightarrow$  ↗ income  $\Rightarrow$  ↗ general expenses  
 $\Rightarrow$  ↗ electricity demand

**Psychology** ↗ moral licensing,  $\searrow$  responsibility,  $\searrow$  consequences  
 $\Rightarrow$  ↗ efficiency  $\Rightarrow$  motivation reappraisal  $\Rightarrow$  ↗ electricity

**Free lunch** PV electricity is a “free good”  $\Rightarrow$  ↗ consumption

**Macro**  $\searrow$  electricity bill  $\Rightarrow$  ↗ growth  $\Rightarrow$  ↗ electricity use

**Network**  $\searrow$  cost new tech.  $\Rightarrow$  ↗ adoption  $\Rightarrow$  ↗ electricity use

**Downstream**  $\searrow$  electricity demand  $\Rightarrow$   $\searrow$  market price  $\Rightarrow$  ↗ electricity demand

# Measurement Approach

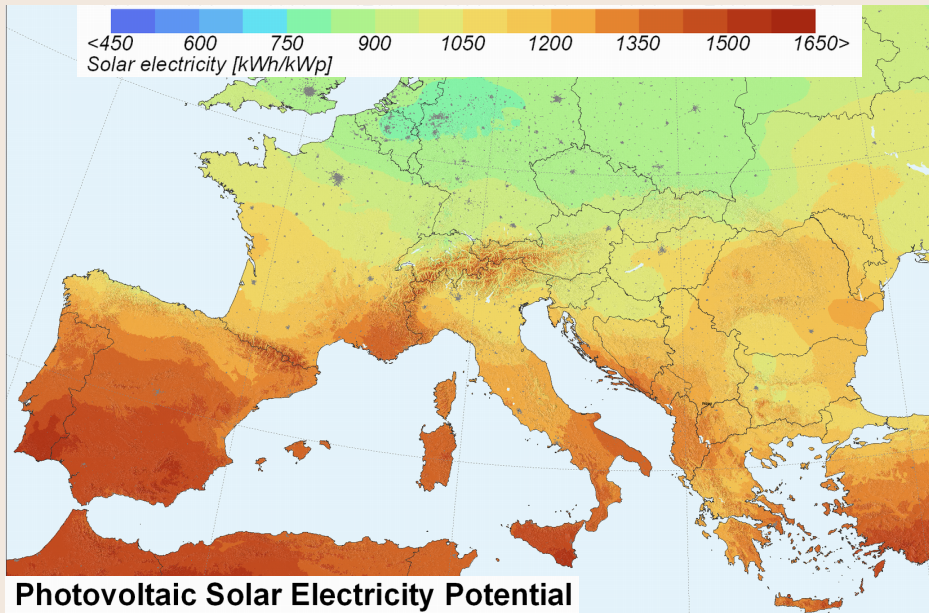
- Two methods to test for direct rebound effect
- #1: estimate elasticities of energy demand (price or energy efficiency)
- #2: compare energy demand before and after energy improvement
- Challenges: confounding factors, measurement errors
- Control group not appropriate ? prosumers  $\neq$  consumers
- Controls: temperature and tariff (electricity price)
- Large sample (+70 000 households)  $\rightarrow$  law large numbers

# Literature

- Large literature on rebounds after energy efficiency improvement
- Few articles on households equipped with PV modules
- Keirstead (2007): UK survey data, self-assessed 5.6% elec. saving
- Wittenberg (2016): DE questionnaire with prosumers vs. consumers  
no significant prosumer effect  
prevalence of storage and automatic load shifting
- Deng (2017): AU billing data sample prosumers vs. consumers  
20% rebound
- Oberst *et al.* (2018): DE small sample prosumers vs. consumers  
electricity consumption proxied by heating expenses  
no significant prosumer effect, no rebound

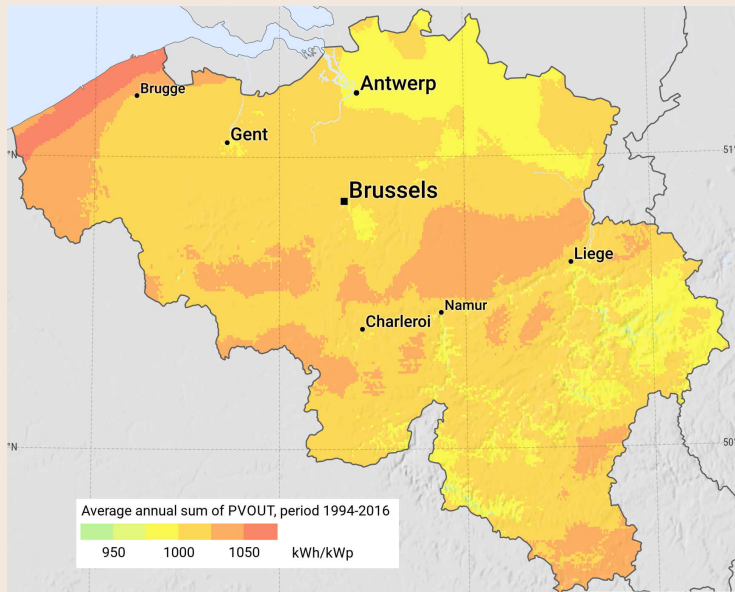
# Solar Irradiation over Europe

- Intermittent source: daily and seasonal scales
- Photovoltaic module ideally inclined and south facing
- Potential in Sahara  $\approx 3000 \text{ kWh/m}^2/\text{year}$
- Potential in Sicily  $\approx 2200 \text{ kWh/m}^2/\text{year}$
- Potential in Wallonia  $\approx 1100 \text{ kWh/m}^2/\text{year}$
- Solar panel not perfect: inverter and transformer losses
- Effective output in kWh/year: 75% of local theoretical maximum





# Photovoltaic power potential of Belgium

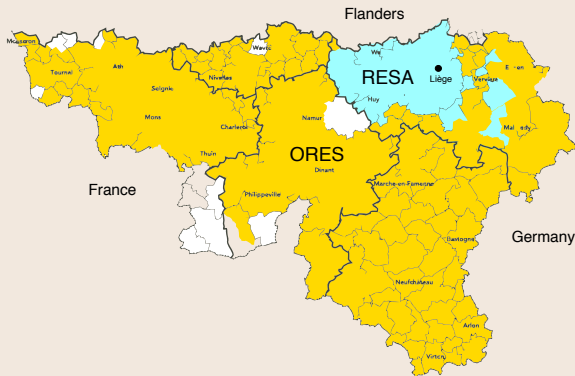


## Household PV Electricity production

- Solar irradiation map: flat distribution over Wallonia
- Effective PV output (monitored by TSO): 10.3%
- Module:  $2\text{m} \times 1\text{m} @ 300\text{Wp} \Rightarrow 268 \text{ kWh/year}$
- Residential maximum PV size for support: 10 kWp
- Up to 33 modules ( $6\text{m} \times 11\text{m}$ )  $\Rightarrow 8930 \text{ kWh/year}$
- Household consumption in Wallonia: 1700 kWh/pc/year
- Maximum PV installation may sustain family of 5
- Large household may reduce net imports with PV
- Small household with large house may produce in excess of need
- Or consume more ...

# Electricity Distribution Operators in Wallonia

- Study universe: Wallonia (262 municipalities)



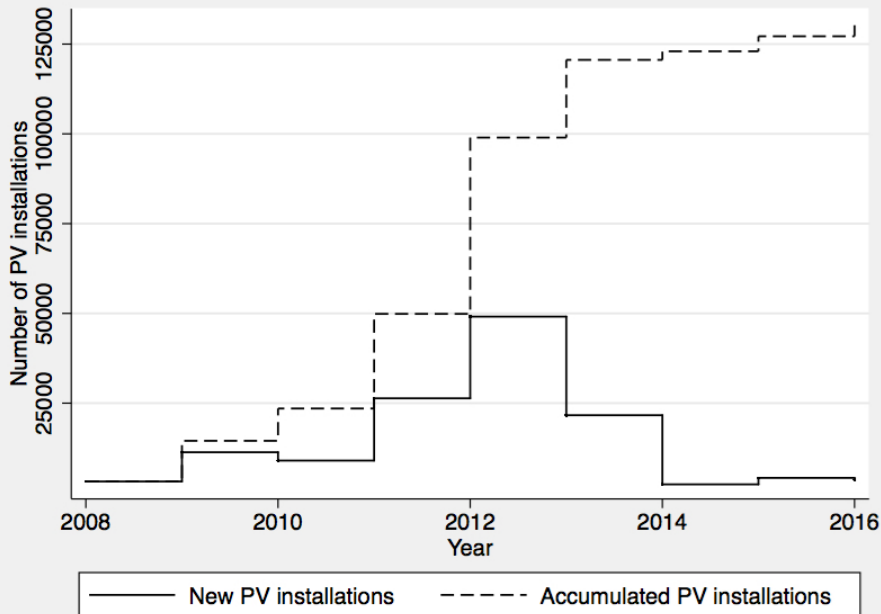
- First stage: exclude Liège region (54 municipalities)
- RESA: merger of 7 smaller DSOs,  $\neq$  electricity tariffs
- About 100 000 households, from 2010 until 2017
- EAN, yearly meter readings, PV installation date and size (kWp)

# Photovoltaic support in Wallonia

- Regional government support schemes
- Solwatt 2007-2014: very generous
- Tradable Green Certificates

Program	Application period	Grant rate (TGC/MWh)	Grant period (years)
Solwatt 1	Jan. 2008 - Nov. 2011	7	15 years
Solwatt 2	Dec. 2011- Mar. 2012	7	10 years
Solwatt 3	Apr. 2012 - Aug. 2012	6	10 years
Solwatt 4	Sep. 2012 - Mar. 2013	5	10 years
Solwatt 5	Apr. 2013 - Feb. 2014	1,5	10 years

- TGC market: RES producers vs. retailers under RPS
- Fixed bounds: floor at 65€/MWh & “no show” fine at 100 €/MWh
- Price fell from 90 to 70 €/MWh between 2007 and 2015



# Photovoltaic development in Wallonia

- Boom in 2012: 50 000 households mount rooftop solar panels
- Germany: 82 M people, 1 M residential solar panels
- Density: Wallonia 1 PV per 29 people, Germany = 1/86
- Solwatt: great success at a great cost
- 2013: reduced TGC allocation, 2014 termination
- Quali watt 2014-2018: fixed premium per panel
- Guarantees return on investment, same 10 kWp limit
- Both schemes: NET METERING
- Meter runs backwards when PV output > household load
- Values PV electricity at retail rate  $\approx 4 \times$  market price
- Limitation: no negative bills if meter difference is negative
- Consequence: excess yearly PV output “given for free” to DSO

# Economic Model of Investment

Representative household may invest into PV system

$\tilde{k}$  PV installation capacity (kWp)

$\rho$  PV module price (€/kWp)

$\beta$  capacity factor of typical PV installation (%)

$k = \beta \tilde{k}$  PV installation output (kWh)

$\eta$  PV subsidy (€/kWh)

$q$  electricity consumption (kWh)

$\hat{q} = q - k$  net metered consumption (kWh)

$p$  retail price of electricity (€/kWh)

$w, z$  income & composite good (unit price)

$\bar{r}$  roof size capacity for PV installation (kWp)

$\bar{k}$  eligibility threshold (kWp)

# Consumer Problem

- Standard utility function  $u(q, z)$
- Total revenue:  $w + \eta k$ , expenses  $z + p \max[0, \hat{q}]$
- Consumer's choice problem:  $\max_{\hat{k}, q, z} u(q, z)$

$$\begin{aligned} z + p \max[0, \hat{q}] + \rho \tilde{k} &\leq w + \eta k, \\ \tilde{k} &\leq \min[\bar{r}, \bar{k}] \end{aligned}$$

- No PV benchmark:  $(q_0, z_0)$  s.t.  $\frac{u_q}{u_z} = p$  and  $z_0 + q_0 p = w$
- Case 1:  $\rho \leq \beta \eta$ , subsidy covers investment cost
- Maximum investment:  $\tilde{k}_1 = \min[\bar{r}, \bar{k}]$
- Let  $\tilde{k}^*$  solve  $\frac{u_q(\beta \tilde{k}^*, w^*)}{u_z(\beta \tilde{k}^*, w^*)} = p$  and  $w^* = w + \tilde{k}^* (\beta \eta - \rho)$



# Equilibrium

**Proposition** When  $\rho \leq \beta\eta$ , consumers choose the largest possible PV installation  $\tilde{k}_1 = \min[\tilde{r}, \bar{k}]$  and

- if  $\tilde{k}_1 \geq \tilde{k}^*$  then eq. is  $q_1 = k_1$  and  $z_1 = w + \tilde{k}_1(\beta\eta - \rho)$
- if  $\tilde{k}_1 \leq \tilde{k}^*$  then eq. is  $(q_2, z_2)$  s.t.  $\frac{u_q(q_2, z_2)}{u_z(q_2, z_2)} = p$ ,  $z_2 = z_1 - p(q_2 - k_1)$
- Property:  $q_1 \geq q^* \geq q_2 \geq q_0$  and  $z_1 \geq z^* \geq z_2 \geq z_0$
- If  $\tilde{k}_1 \leq \tilde{k}^*$ :  $\nearrow$  consumption due to **income** effect
- If  $\tilde{k}_1 > \tilde{k}^*$ : added **zero marginal price** effect
- Prosumers consume more than standard (no PV) consumers
- Net Metering  $\Rightarrow$  discontinuous electricity price at  $q = k$

## Equilibrium (cont.)

- Case 2  $\beta\eta \leq \rho \leq \beta(\eta + p)$ , net metering  $\Rightarrow$  investment profitable
- Investment profitable only if  $q \geq k = \beta\tilde{k}$  (no wasted generation)
- Consumer's choice problem:  $\max_{\tilde{k}, q, z} u(q, z)$

$$z + p\hat{q} + \rho\tilde{k} \leq w + \eta k,$$

$$\tilde{k} \leq \min \left[ \frac{q}{\beta}, \bar{r}, \bar{k} \right]$$

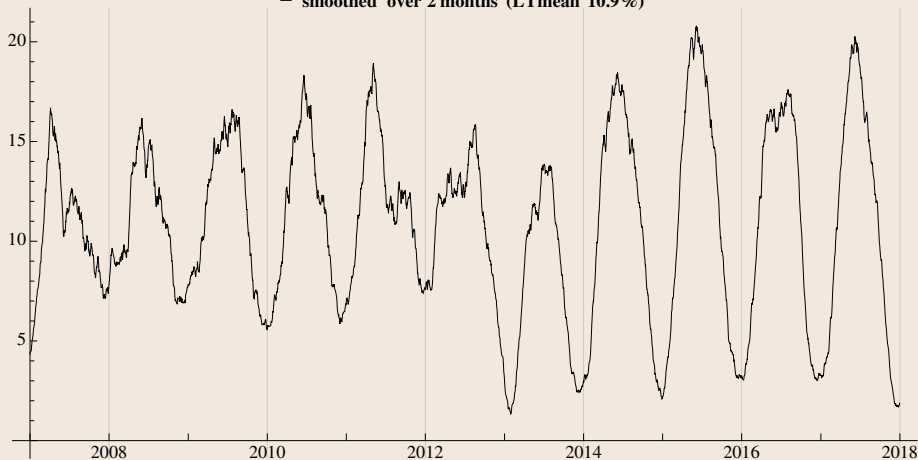
- Solution:  $\frac{u_q(q_3, z_3)}{u_z(q_3, z_3)} = p$  and binding investment
- Case 3  $\beta(\eta + p) \leq \rho$ , solar panels unprofitable
- Solution  $\tilde{k} = 0$  and no PV bundle  $(q_0, z_0)$

# Reconstructing individual load curves

- Billing period  $[t_1, t_2]$  with total consumption  $Q$
- Daily equivalent consumption  $\frac{Q}{t_2 - t_1}$
- Synthetic load curve (SLP) Liège region: temporal index
- Average index over billing period  $\bar{s} = \frac{1}{t_2 - t_1} \sum_{t_1}^{t_2} s_t$
- Reconstructed household load:  $q_t = \frac{s_t}{\bar{s}} \frac{Q}{t_2 - t_1}$
- PV installation month  $\tau$
- PV monitoring by TSO: capacity factor  $\beta_t$  from 2012 to 2018
- Pre-2012: Liège Airport Weather Station's daily sunshine minutes
- Household  $\tilde{k}$  daily solar PV production  $k_t = \beta_t \tilde{k}$

## Daily Capacity Factor of Solar PV in Wallonia (%)

— smoothed over 2 months (LTmean 10.9%)



Year	2007	2008	2009	2010	2011	2012	2013	2014	2015	2016	2017
CF	10.5	10.8	11.5	10.9	12.1	11.	7.5	10.9	11.7	10.9	10.9

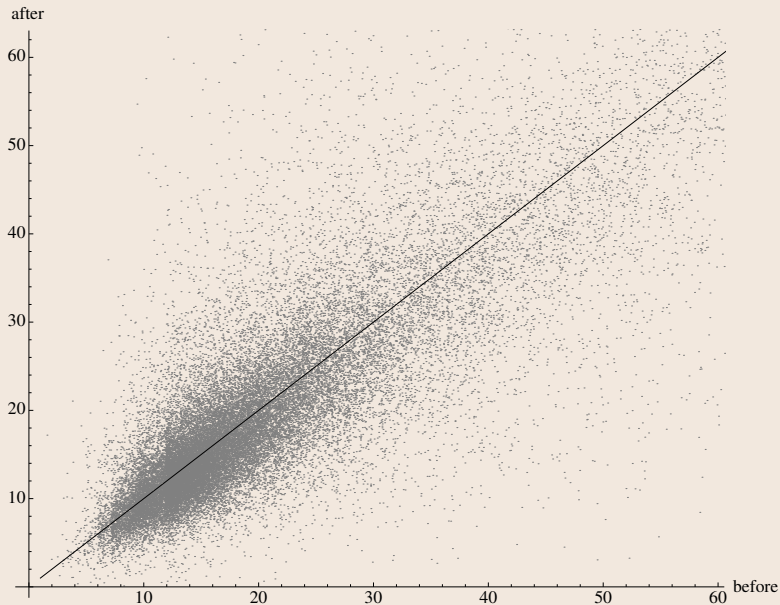
# Reconstructed Household Load Curve including PV output



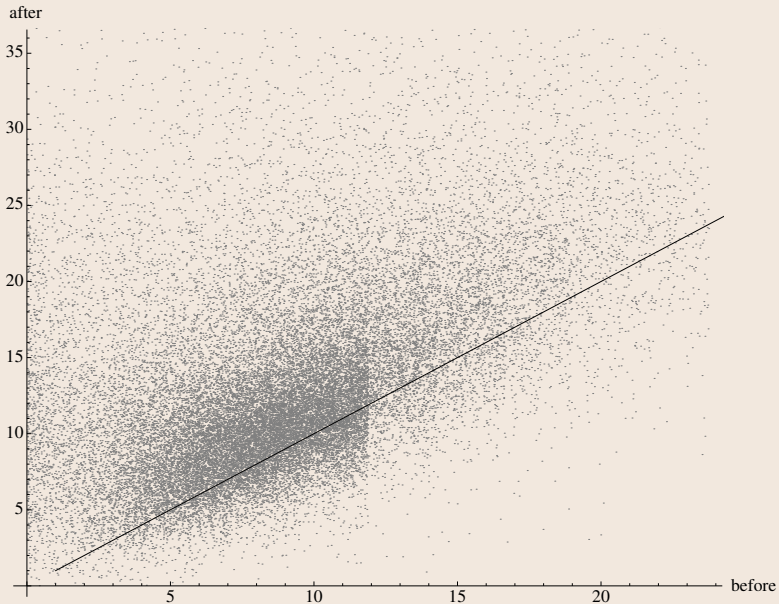
# Estimation strategy

- Before vs. After: load over  $[\tau - 24, \tau]$  and  $[\tau, \tau + 24]$  months
- Load change:  $\Delta q = \mathbb{E}[q_t | t > \tau] - \mathbb{E}[q_t | t \leq \tau]$
- Temperature:  $\Delta \zeta = \mathbb{E}[\zeta_t | t > \tau] - \mathbb{E}[\zeta_t | t \leq \tau]$
- “Oversized” indicator  $\theta = \mathbb{E}[k - q | k > q]$  (over  $[\tau - 24, \tau]$ )
- Mean tariff  $p$  over  $[\tau - 24, \tau + 24]$
- Meter reading is error prone (e.g., re-initialization)
- Algorithmic recognition not enough
- Exclude top and bottom 2% data points for  $q_t$  distribution
- Graphical look at differences in behavior: oversized vs. undersized

# Consumption before/after, undersized group



# Consumption before/after, oversized group





## Results

- Equation:  $\Delta q = \alpha + \beta_1 \Delta \zeta + \beta_2 p + \beta_3 \tilde{k} + \beta_4 \theta + \epsilon$
- Run: 63691 observations,  $R^2 = 0.25$

Variable	Estimate	Standard Error	t-Statistic	P-Value
$\alpha$	1.3481	0.1697	7.94506	$1.9 \cdot 10^{-15}$
p	-0.1164	0.01841	-6.32335	$2.5 \cdot 10^{-10}$
$\tilde{k}$	-0.0122	0.00538	-2.26794	0.02333
$\theta$	0.9722	0.00712	136.572	$3.4 \cdot 10^{-3555}$
$\Delta \zeta$	2.1087	0.0676	31.1784	$8.2 \cdot 10^{-212}$

- Coefficients significant at the 1% level
- Tariff impact as expected
- Large PV owners have slightly lower consumption increase
- Rebound ( $\theta$ ): for oversized households (low original consumption)
- Every additional kWh generated is consumed (almost)

## Conclusion & Future Work

- Article test rebound effect of solar PV residential installation
- Exhaustive dataset from Wallonia
- Oversizing PV installation due to generous support scheme
- Net metering creates strong “free electricity” illusion
- Households almost entirely consume this free energy
- Beware: net generation in summer, net load in winter
- Additional stress on DSO grid, possible added local pollution
- Few RES electricity reverted to network for Climate Change action
  
- Extend to Liège région
- Improve econometrics
- Thank you