

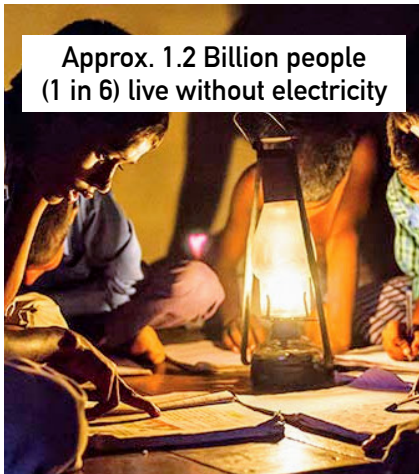
# The Adverse Effects of Electrification: Evidence from India

Fenella Carpena  
Oslo Business School

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# Motivation

Approx. 1.2 Billion people  
(1 in 6) live without electricity



Electrification programs have  
attracted policy support and  
billions of dollars



7 AFFORDABLE AND  
CLEAN ENERGY



Programa  
**LUZ**  
para todos

POWER  
AFRICA

# Existing Evidence on the Effects of Electrification

## Positive Effects

- Increased female employment (e.g., Dinkelman, AER 2011)
- Reduced poverty rates (e.g., Lipscomb et al., AEJ:A 2013)
- Improved health (e.g., Barron and Torero, JEEM 2017)

## Negative Effects

- Relatively unexplored

### This paper

- Rural India
- Electrification increases price of alternative lighting fuel
- Negatively impacts those who do not adopt electricity

# This paper: Electrification adversely affects non-adopters

- 1 **Descriptives:** Lighting is one of the main uses of electricity
  - Electrification impacts the market for alternative lighting
  - Main alternative: kerosene (paraffin)
- 2 **Empirics:** Diff-in-diff using India's National Rural Electrification Program
  - *Main result: electricity entry* → kerosene prices 5-10% ↑
  - Higher kerosene prices hurts electricity non-adopters
  - Non-adopters also the poorest HHs
- 3 **Theory:** Construct a model extending Salop (1979)
  - *Potential mechanism for price increase:* ↓ market size
  - Kerosene retailers incur fixed costs
  - In equilibrium, price = average cost
  - Electrification causes the pool of kerosene buyers to shrink

# This paper: Contributions

## Research

- Development Economics: Fills a knowledge gap on the impact of electrification on markets
- IO: Contributes to small but growing literature on the price-increasing effects of competition (e.g., Stiglitz, 1987; Schulz and Stahl, 1996)

## Policy

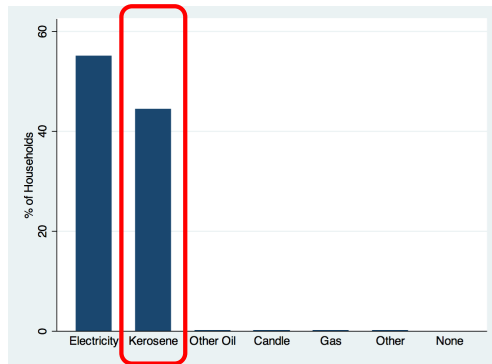
- Speaks to ongoing debate in many countries on removing kerosene subsidies
- Relates to a bigger theme on the potential negative consequences of the introduction of new technologies

# Motivating Facts

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- 1 Next to electricity, kerosene is the second most common energy source for lighting among rural households.

Figure: Main Lighting Energy Sources of Rural Households

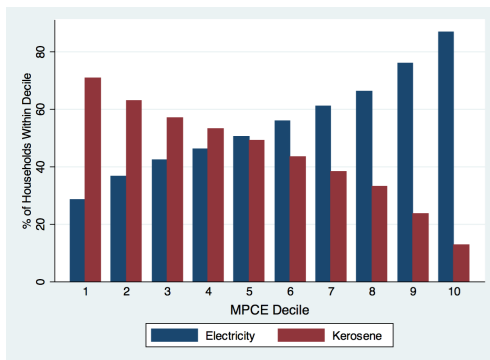


→ Kerosene markets in rural areas are tightly linked with power sector reforms.

# Motivating Facts

## ② Kerosene use is more prevalent among the poor.

Figure: Kerosene/Electricity use by expenditure deciles



→ The poor are more vulnerable to kerosene price increases.



# Empirical Context

# India's National Rural Electrification Program

- Rajiv Gandhi Grameen Vidyutikaran Yojana (RGGVY) or the Prime Minister's Rural Electrification Scheme ("the program")
- Nation-wide program **launched in 2005**, implemented during 10th (2002-2007) and 11th (2007-2012) Five-Year Plans
- Electrification projects were executed at the **district-level**, two main components:
  - ① **Electricity distribution infrastructure:** substation in each subdistrict; install distribution transformers in each village
  - ② **Free household connections:** provided to Below Poverty Line (BPL) HHs; above poverty line are required to pay connection fee (about Rs. 3000)
- **Implementation/Treatment Date** in this paper: when project funds are first disbursed to the district.

# Data

# Main Outcome of Interest: Kerosene Prices

- 1 National Sample Survey (NSS) Consumer Expenditure
  - Socio-economic survey, all of India (except inaccessible areas)
  - Annual data from 2001-2007, 2009, 2010
  - HH-level consumption of kerosene (past 30 days)  
→ unit value (total expenditure  $\div$  qty consumed)
  - Proxy for price: **median unit value, by district-year**
- 2 Rural Price Collection Data
  - **Actual prices** (micro-data for CPI)
  - Covers 603 markets in 26 states, but only 1/2 of all districts
  - Market-level, monthly data from 2001-2011

# Empirical Method

# Differences-in-Differences: 3 District-level Regressions

## 1 Discrete Treatment Variable

$$y_{dt} = \beta RGGVY_{dt} + \gamma_d + \lambda_t + \delta \mathbf{X}_{d2001} t + \epsilon_{dt}$$

- $RGGVY_{dt}$ : dummy turning on when the program is implemented in district  $d$  at time  $t$
- District fixed effects:  $\gamma_d$ ; Time fixed effects:  $\lambda_t$
- $\mathbf{X}_{d2001} t$ : vector of 2001 baseline district characteristics interacted with time trend

## 2 Continuous Treatment Variable

$$y_{dt} = \beta Connections_{dt} + \gamma_d + \lambda_t + \delta \mathbf{X}_{d2001} t + \epsilon_{dt}$$

- $Connections_{dt}$ : 0 in pre-program years; then, BPL HH connections as a proportion of total HHs in Census 2001

# Differences-in-Differences: 3 District-level Regressions

## 3 Event Study

$$y_{dt} = \sum_{k=-4}^5 \beta_k D_{dt}^k + \gamma_d + \lambda_t + \delta \mathbf{X}_{d2001} t + \epsilon_{dt}$$

- $D_{dt}^k$ : dummy variable indicating in district  $d$  at time  $t$ , RGGVY was implemented  $k$  periods ago
- First lead  $D_{dt}^{-1}$  is excluded, so  $\beta$ 's estimated relative to year before implementation
- Direct test of identifying assumption of diff-in-diff
- Shows dynamic effects of RGGVY over time

# Empirical Results



# Empirical Results

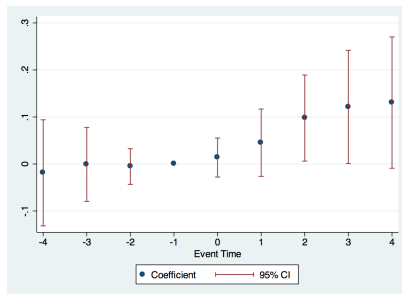
**Table:** Dependent Variable: Proportion of HHs in the District using Electricity or Kerosene as Main Source of Lighting

	Electricity		Kerosene	
	(1)	(2)	(3)	(4)
RGVY Dummy	0.012*		-0.014**	
	(0.007)		(0.007)	
RGVY BPL Connections		0.137***		-0.153***
		(0.029)		(0.029)
District FEs	Yes	Yes	Yes	Yes
NSS Round FEs	Yes	Yes	Yes	Yes
2001 District Vars $\times$ Linear Time	Yes	Yes	Yes	Yes
Adj. R-squared	0.828	0.829	0.831	0.832
N	5399	5399	5399	5399

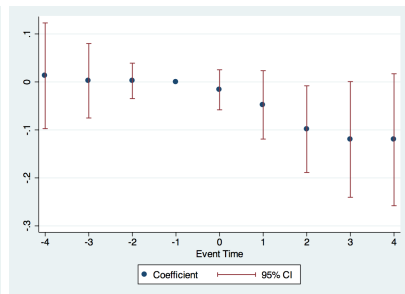
Year prior to government's launch of RGVY: Ave. proportion of rural HHs using electricity as main source of lighting: 0.62; kerosene: 0.44. Median treatment intensity: 14% BPL Coverage

# Empirical Results

Figure: Event Study on Electricity and Kerosene Use



(a) Electricity



(b) Kerosene

Regression sample restricted to districts treated during the 10th Plan to achieve a balanced panel of districts before/after RGGVY implementation. Coefficient at event time  $t = -1$  is zero by construction (omitted category in the regression).

# Empirical Results

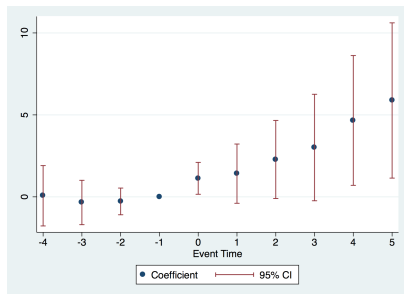
**Table:** Dependent Variable: Kerosene Prices (Rupees, unit values)

	Nominal Kerosene Price		Real Kerosene Price	
	(1)	(2)	(3)	(4)
RGGVY Dummy	0.809*** (0.272)		0.436** (0.207)	
RGGVY BPL Connections		2.358* (1.258)		1.282* (0.711)
District FEs	Yes	Yes	Yes	Yes
NSS Round FEs	Yes	Yes	Yes	Yes
2001 District Vars $\times$ Linear Time	Yes	Yes	Yes	Yes
Adj. R-squared	0.672	0.671	0.491	0.491
N	5122	5122	5122	5122

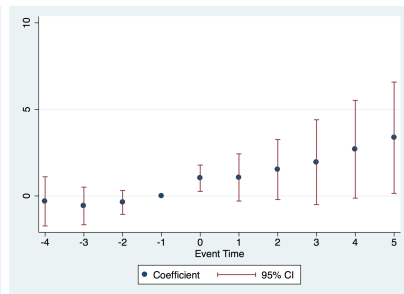
Dependent variable is the median unit value of kerosene from the NSS, for each district-year. Pre-program kerosene prices: Rs. 15 (nominal), Rs. 13.7 (real). Median treatment intensity: 14% BPL Coverage

# Empirical Results

Figure: Event Study on Kerosene Prices, Rupees (unit values)



(a) Nominal Price



(b) Real Price

Regression sample restricted to districts treated during the 10th Plan to achieve a balanced panel of districts before/after RGGVY implementation. Coefficient at event time  $t = -1$  is zero by construction (omitted category in the regression).

# Empirical Results

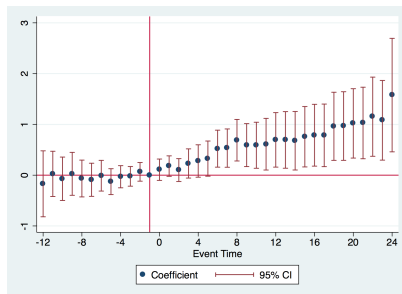
**Table:** Dependent Variable: Kerosene Prices (Rupees, CPI micro-data)

	Nominal Kerosene Price		Real Kerosene Price	
	(1)	(2)	(3)	(4)
RGGVY Dummy	1.295*** (0.363)		0.919*** (0.336)	
RGGVY BPL Connections		4.962*** (1.664)		1.802** (0.872)
Market FEs	Yes	Yes	Yes	Yes
Month FEs	Yes	Yes	Yes	Yes
2001 District Vars $\times$ Linear Time	Yes	Yes	Yes	Yes
Adj. R-squared	0.834	0.835	0.799	0.798
N	27361	27361	27361	27361

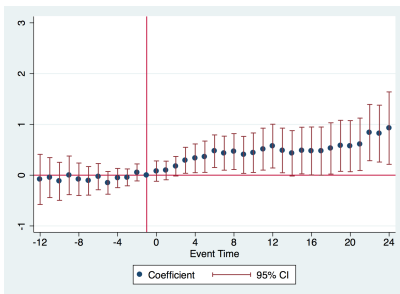
Dependent variable is kerosene price from the CPI micro-data, at the market-month level. Average pre-program kerosene price: Rs. 15 (nominal), Rs. 14.5 (real). Median treatment intensity: 14% BPL Coverage

# Empirical Results

Figure: Event Study on Kerosene Prices, Rupees (CPI micro-data)



(a) Nominal Price



(b) Real Price

Regression sample restricted to a balanced panel of districts before/after RGGVY implementation. Coefficient at event time  $t = -1$  is zero by construction (omitted category in the regression).

# Robustness Checks

- Placebo Tests
  - Urban areas (not covered by the program) electricity/kerosene use, kerosene prices
  - Rural price of rice
  - Rural price of subsidized kerosene
- Functional Form
  - Log kerosene prices
- Control Variables
  - No controls
  - Alternative: quartiles of baseline chars. interacted w/ time

Why do kerosene prices increase?



# Why do kerosene prices increase?

- Electricity and kerosene are close substitutes.
- Standard supply/demand framework would predict prices fall.
- To better understand how electrification would affect kerosene prices, I adapt the Salop (1979) circular model.
  - Monopolistically competitive model, used in retail settings
  - Captures spatial differentiation across kerosene retailers
- Basic intuition:
  - Kerosene sellers have fixed costs
  - In equilibrium, price equals average cost
  - When market size falls, prices may increase

# Conclusion

- Rural electrification is increasingly being used as a policy tool for boosting development
- But their negative consequences are unclear
- Studying India's national rural electrification program, I show that electricity provision leads to higher kerosene prices
- These higher prices negatively impact the welfare of poor households, who continue to rely on kerosene
- Higher kerosene prices can be explained by a model where  
 $\downarrow$  market size  $\implies$   $\uparrow$  average costs and thereby prices.

Thank you!