

Electrification, Environment, and Economic Development in Developing Countries

PhD Defense

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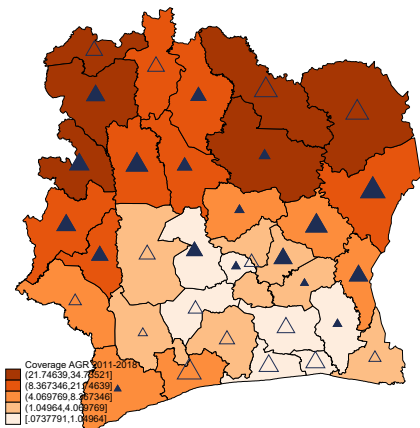
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Motivation

- **Reliable electricity** \Rightarrow economic growth, poverty reduction, improved quality of life:
 - It can increase firms' productivity, reduce production costs and increase the producer's surplus and income (Rud, 2012; Fisher-Vanden et al., 2015; Allcott et al., 2016).
 - It accelerates **structural transformation** (Rud, 2012) and enhances **economic development** (Ferguson et al., 2000; Wolde-Rufael, 2006).
- However, **electrification programs** raises concerns about their **potential environmental impact** (Villoria et al., 2014).



Solid triangles indicate values over the mean of Forest loss AGR 2011-2018.
Source: MPEER, Hansen et al, 2013

Motivation

- We explore the links between electrification, deforestation, and economic development.
- The primary goal is to offer valuable insights into the impacts of electrification on both **environmental sustainability** and **economic development** in the context of ongoing electrification efforts.
- The findings presented in this thesis could guide decision-makers in crafting policies that promote a harmonious balance between **economic development** and **environmental conservation**.

Outline

- 1 Chap I – Access to electricity and household practices potentially contributing to forest loss in Côte d'Ivoire
- 2 Chap II – Electrification and Deforestation in Côte d'Ivoire: a spatial econometric analysis
- 3 Chap III – Power Sector Regulation and Private Investment in Power Generation: Evidence from Africa
- 4 Chap IV – Power Constraints and Firm-level Total Factor Productivity in developing countries

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Background

- From **16 million ha** of forest in the 1960s, the country now has only about **2.5 million ha**.
- **Cocoa plantations** as source of a loss of **200,000 ha/yr** (SODEFOR). Agricultural sector ⇒ **62%** of the forest loss (REDD+, 2018).
- Around **2.4 million tons** of firewood are consumed annually for cooking and heating (IEA, 2021). Biomass ⇒ **80%** of the country's total energy consumption.
- Ivorian government initiated an extensive electrification program (Axis III of the Ps-Gouv).
- The program has 3 components: PRONER, PEPT, and 20% reduction in the social tariff.
- Installed capacity increased from **1,391 MW** in 2011 to **2,230 MW** in early 2022. **6949 localities** (over 8518) electrified, and the coverage rate raises from **33%** to **82%**.

- Electrification reduces the need both to expand farms and to collect firewood, and is therefore an **effective way to mitigate deforestation** (An et al., 2002; Dube et al., 2014; Mensah and Adu, 2015; Tanner and Johnston, 2017; Bakehe and Hassan, 2022).
- Nevertheless, the extension of the electricity network (migration) or the improvement in agricultural profitability (cash crop) generated by electrification could be a **source of deforestation** (Geist and Lambin, 2002; Villoria et al., 2014).

Research question

- 1 What is the relationship between electricity access and biomass fuel consumption in Côte d'Ivoire?
- 2 How does electricity access influence the size and expansion of arable farms?

Data

- Last four waves of the Households LSMS (1998, 2002, 2008 and 2015) in the country, **nationally representative**.

Methodology

- We adapt [Angelsen \(1999\)](#)'s **theoretical framework and explore a potential link** between electrification and arable land expansion from a theoretical point of view.
- **Cohort fixed effects** as our main specification **to capture the unobservables factors as long as they are fixed over time**.
- Robustness check to **several alternative specifications** when observing households instead of cohorts of households (probit, matching, weighting).

We highlight:

Main results

- Robust evidence that the **electrification significantly reduces both arable farms size and biomass fuel consumption** (firewood collection).
- We also document that the **effect is driven by the rural areas**.
- We provide evidence on a **threshold effect of 80%**.

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Background

- **Same forest loss overview and electrification effort** in Cote d'Ivoire as pointed out in Chap I.
- Previous analysis on the issue are **micro** or **macro**. We propose an intermediate level of scale between micro and macro (**meso**).
- [Mensah and Adu \(2015\)](#) focus on the decrease in the use of wood for cooking due to electrification in Ghana.
- [Tanner and Johnston \(2017\)](#) on a panel of 158 countries for the years 1990, 2000 and 2010. They show that access to electricity in rural areas reduces deforestation rates.

Research question

- 1 To what extent does improved electricity access influence overall deforestation in Côte d'Ivoire?
- 2 Does the spatial scale matter?

Data

- **Deforestation:** Forest cover loss event available at regional and departmental scale ([Hansen et al., 2013](#)).
- **Electrification:** Evolution of the coverage rate available at the regional scale only (MPEER). Night lights intensity data available at regional and departmental scale (NOAA National Geophysical Data Center).
- **Controls:** Precipitation and Temperature (University of Delaware); Population density ([Warszawski et al., 2017](#)); Gross Domestic Product in millions of dollars ([Ghosh et al., 2010](#)); Percent forest cover ([Hansen et al., 2013](#)); ACLED Conflict Events ([Raleigh et al., 2010](#)); Travel time to major cities ([Nelson, 2008](#)).

Methodology

- Exploratory spatial data analysis and Choice of the best spatial specification.
- Random effects model with a SAR process.
- As highlighted in this literature (see [Baggio and de Barros, 2021](#); [Robalino and Pfaff, 2012](#)), the **analysis of the deforestation phenomenon requires the consideration of spatial interactions between different localities.**

We highlight:

Main results

- The **concordance** of the night lights intensity data with the official data.
- The existence of **spatial interaction depends on the chosen spatial scale**.
- That after considering the optimal spatial scale and taking into account both spatial effects and unobservable individual and temporal effects, our empirical results suggest that **electrification increases overall deforestation in Cote d'Ivoire** contrary to [Tanner and Johnston \(2017\)](#).

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Background

- **Weak access to electricity in Africa due mainly to the lack of adequate public investment in the sector:**
 - Access to electricity in Africa in 2020 is estimated at **54%** (IEA).
 - Nearly **600 million Africans** still do not have access to electricity.
 - Severe economic and fiscal constraints (ERI 2020).
- **Opening up of power generation to private actors in order to provide the capital needed to meet the challenges (IPPs/PPPs):**
 - But private actors also face major challenges: **local capital markets are weak and limited** (debts essentially denominated in foreign currencies) and **inputs are mostly imported**.
 - Currency depreciation leads to an **increase in the debt burden for private actors and the cost of imported inputs**.

- **Favourable role** (Pargal, 2003; Wallsten, 2002; Rubino and Cuomo, 2015); in **developing countries** (Andres et al., 2007; Cubbin and Stern, 2005; Gassner et al., 2009), and in **electricity sector** (Bergara et al., 1998; Zhang et al., 2008; Cubbin and Stern, 2006).
- **IRA do not guarantee an improvement in private investment** due to **political interference** or **not adapted measures** (Parker and Kirkpatrick, 2012; Bertoméu-Sánchez et al., 2018; Andrés et al., 2013; Carvalho et al., 2012; Estache et al., 2010).

Research question

- 1 How do currency and inflation crises potentially impact power generation in Africa?
- 2 To what extent does the presence of an IRA, an automatic tariff adjustment mechanism, and the cost reflectivity help mitigate challenges within the power generation sector?
- 3 How do various regulatory strategies compare in their efficacy to mitigate the negative effect of crises on private investments in the power generation industry?

Data

- Data collection from official sources, ERI, and U.S. Energy Information Administration (EIA). We consider a panel of 54 African countries over the period 1990-2019.

Methodology

- Theoretical framework based on [Nucci and Pozzolo \(2001\)](#): **lack of integration of inter-country power networks**, and **need for actions**.
- **Local projections** combined with a '**doubly robust**' estimator, AIPW ([Jordà, 2005](#); [Lunceford and Davidian, 2004](#); [Jordà and Taylor, 2016](#)).
- Robustness using [De Chaisemartin and d'Haultfoeuille \(2022\)](#) DID estimator.

We highlight:

Main results

- Inflation and currency crises (-) **affect** private participation in power sector investment.
- These (-) **effects are mitigated for the countries that have established an IRA** compared to countries without.
- **Cost reflexivity would be much more effective**, followed by the automatic tariff adjustment mechanism, compared to a IRA.

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Background

- Better power infrastructure \Rightarrow economics growth and development outcomes.
- But in developing countries firms faced difficulties to connect to the grid / frequent outages.
- For 45.9% of firms in AFR and 41.2% in SAR, power is a major or severe constraint.
- **Negative effect** (Fisher-Vanden et al., 2015; Allcott et al., 2016; Cole et al., 2018; Elliott et al., 2021; Hardy and McCasland, 2021; Abeberese et al., 2021), **Significant but weak effect** (Grainger and Zhang, 2017), **No significant effect** (Scott et al., 2014).

Research question

- 1 How do power constraints influence the productivity of manufacturing firms in DC?
- 2 How does the impact of power constraints on firms' productivity vary based on their severity?
- 3 What are the potential pathways through which power constraints affect firms' productivity?
- 4 How do the effects vary across different levels of economic development and geographical regions?

Data

- The World Bank Enterprise Surveys (**31,406 manufacturing firms in 84 developing countries** from 2006 to 2019).

Methodology

- Theoretical framework based on that of [Hsieh and Klenow \(2009\)](#) and [Xiao et al. \(2022\)](#).
- The effect is either **negative**, **positive**, or **indefinite** following the value of the **elasticity of substitution**.
- The infinite limit of the effect **converges toward zero**.
- Empirical approach: to **compensate for the limits linked to the Hydro-IV** (as in [Fisher-Vanden et al., 2015](#); [Allcott et al., 2016](#); [Cole et al., 2018](#); [Elliott et al., 2021](#)), we use a weighting-based approach (**Entropy Balancing**, [Hainmueller, 2012](#)) + large set of robustness checks (without weighting, clustered by industry, alternative outcome, placebo test, etc.).

We highlight:

Main results

- A (-) **effect** of outages on TFPR and a strong **link between the severity of self-reported power constraints** by firms and the magnitude of productivity loss.
- The (-) **effect found in LIC far exceeds those found in MIC. Significant effect** only for the **LIC** (\approx SSA) and for the **Upper MIC** (\approx MENA).
- Transmission channels: **capacity utilization** and **losses in % of sales**.
- Mitigating factors: **back-up generator reduces the negative effect by half** and **R&D mitigates the negative effects**.

Concluding remarks & Policy recommendations

Chapter I & Chapter II:

- Promote **alternative energy access policies** to reduce huge subsidies (e.g. mobile money roll out).
- **Locality-level analysis** to address the potential issue of intra-country heterogeneity highlighted by [Tanner and Johnston \(2017\)](#).
- Partial **favorable** effects Vs Overall **unfavorable** effects.

Chapter III & Chapter IV:

- Promote **local production of equipment, domestic capital mobilization**, and more **renewable energy sources**.
- **Back-up generator reduces the negative effect of power constraints by half**, but do not fully correct the shocks.
- **Set up IRA + tariff** (tariff adjustment, cost reflectivity, etc.) and **non-tariff** measures (master plan) + **Open up generation to private actors** (through IPPs, PPPs, etc.) + **Improved institutions to attract FDI** \Rightarrow virtuous circle for the economy.

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