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# CONNECTING TO ELECTRICITY: TECHNICAL CHANGE AND REGIONAL DEVELOPMENT

Atsuki Kotani

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The Institute of Social and Economic Research Osaka University 6-1 Mihogaoka, Ibaraki, Osaka 567-0047, Japan

# Connecting to Electricity: Technical Change and Regional Development \*

# Atsuki Kotani <sup>†</sup>

The University of Tokyo

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**ABSTRACT:** The technical change from steam engines to electric motors dramatically transformed manufacturing activities during the Second Industrial Revolution. This paper explores how this technical change progressed and what consequences it brought for the evolution of economic geography. I hypothesize that electric motors powered by purchased electricity lowered barriers to entry in the manufacturing sector due to their significantly lower fixed costs compared to steam engines. To examine this hypothesis, I exploit the historical expansion of electricity grids in early 20th-century Japan and newly digitized establishment-level official records, including information on power sources of establishments. Descriptive evidence shows that electric motors were widely adopted by establishments of all sizes, whereas steam engines were primarily adopted by large establishments, indicating lower fixed costs of electric motors. Using hydropower potential as an instrument, I document that new entrants played a crucial role in driving this technical change and stimulating manufacturing activities. Overall, these findings lend substantial support for the hypothesis. Furthermore, I find that regions with earlier electricity access experienced substantial population growth throughout the early 20th century and exhibit larger economic activity even in the 21st century. These findings suggest a persistent impact of this technological shock: the rapid increase in entrant activities generated agglomeration forces in manufacturing, with accumulated effects still visible in the spatial distribution of economic activity today.

JEL Classification: F63, L26, L94, N65, O14, R12 Keywords: Technical change, Entrant, Structural transformation, Historical persistence

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<sup>&</sup>lt;sup>†</sup>Department of Economics, The University of Tokyo. (Email: kotani-atsuki@g.ecc.u-tokyo.ac.jp)

### **1** Introduction

Technical change is a key driver of economic growth, and the early 20th century witnessed a groundbreaking shift in general-purpose technology—from steam engines to electric motors (Bresnahan and Trajtenberg, 1995). The process of electrification entailed an expansion of manufacturing activities, leading to structural transformation and socioeconomic change (Mumford, 1934; Gordon, 2017). While it is well documented that many technologies, such as the steam engine, are slow to diffuse despite their considerable benefits (Hall and Khan, 2003; Hall, 2004), the transition from steam engines to electric motors occurred rapidly.<sup>1</sup> Despite its substantial and swift impact on economic activities, we know little about how this technical change progressed and what consequences it brought about for long-run regional development.

The primary goal of this paper is to examine the mechanism that underlies this dramatic transition from steam engines to electric motors that accompanied the rapid expansions of manufacturing activities, highlighting the driving forces behind the structural change during the Second Industrial Revolution. Specifically, I shed light on the substantial reduction in *fixed costs* of technology adoption that accompanied the shift from steam engines to electric motors driven by purchased electricity. While both steam engines and electric motors are considered general-purpose technologies designed to convert energy into rotary motion for manufacturing, they differ significantly in their adoption costs. This technical distinction leads to the hypothesis that electric motors, with their much lower fixed costs compared to steam engines, played a crucial role in lowering barriers to entry in the manufacturing sector with powered factory, in turn stimulating manufacturing activities.

In this paper, I investigate this hypothesis by exploiting the historical expansion of electricity grids in early 20th-century Japan and newly digitized official records. Due to topographical features in Japan—characterized by mountainous terrain and fast-flowing rivers—and transmission technology development, the expansion of electricity grids during this period was largely driven by hydropower generation. This historical context makes it possible to isolate the variation in grid expansion that is attributable to geographic suitability for hydropower generation, which I use as an instrument for early electricity access. Additionally, to explore the underlying mechanisms of this technical change and its impact on manufacturing activities, I collect and digitize establishment-level official records, including information on power sources and employees, as well as municipality-level data on electricity access. This historical context and newly digitized data allow for identifying the effects of electricity access on manufacturing activities, with a particular focus on the role of electric motors and new entrants.

<sup>&</sup>lt;sup>1</sup>For example, in 1910, approximately 75% of horsepower in Japan was generated by steam engines, but by 1930, electric motors had overtaken steam engines, accounting for 80% of horsepower (Minami, 1979).

I begin by describing the historical background. Although the steam engine was an iconic innovation of the First Industrial Revolution, its high fixed costs—requiring extensive and complex workshops—hindered its widespread adoption. In contrast, electric motors powered by purchased electricity involved much lower fixed costs, as they freed manufacturers from the need to install on-site power generators and allowed for simpler, more compact operations. Using establishment-level data, I demonstrate that smaller establishments were less likely to adopt steam engines. Furthermore, I find that after the electricity grid expansion, there was a significant and uniform increase in the adoption of electric motors across all establishment sizes. These findings suggest that, while steam engines favored larger factories, electric motors democratized power-driven production and lowered barriers to entry in the manufacturing sector.

To test the hypothesis motivated by the historical context, I introduce hydropower potential as an instrument for early electricity access. This measure, developed in the hydraulic engineering literature, evaluates the geographical potential for hydroelectric power generation (Basso and Botter, 2012; Müller et al., 2014). Specifically, I employ the potential for run-of-river hydropower generation estimated by Arai et al. (2022), calculated as the product of water volume and hydraulic head height. I use this geographical variation as an instrument, controlling for streamflow and ruggedness that can otherwise influence local economic activities.<sup>2</sup>. To support the validity of the instrument, I provide two sets of evidence. First, higher hydropower potential leads to the construction of hydropower stations and early electricity access, confirming the instrument's relevance. Second, hydropower potential is correlated with manufacturing activities only after the expansion of electricity grids. This result indicates that hydropower potential offers a plausible source of variation in electricity access that is exogenous to preexisting determinants of manufacturing activities.

As a baseline analysis, I estimate the effect of electricity access on manufacturing activities using hydropower potential as an instrument. The results show that electricity access significantly increased the number of establishments, resulting in approximately 6.6 times the average increase. Moreover, electricity access not only stimulated the adoption of electric motors but also increased manufacturing employment. Overall, these findings suggest that electricity access played a pivotal role in driving manufacturing activities in early 20th-century Japan. A series of robustness checks confirm that these effects were not driven by unobserved preexisting regional characteristics or time-varying confounding factors, such as improvements in railway access or infrastructure investments.

Furthermore, by isolating the effect by new entrants and incumbents, I explore the underlying

<sup>&</sup>lt;sup>2</sup>Several studies have used hydropower potential as an instrument for the construction of hydroelectric power stations, the length of high-voltage transmission lines, and the amount of electricity used in manufacturing (Leknes and Modalsli, 2020; Gaggl et al., 2021; Reichardt, 2024)

mechanisms of this technological change and its impact on manufacturing activities. The estimation results indicate that the increase in the number of establishments was primarily driven by new entrants. In particular, new entrants accounted for 70% of the total effect on electric motor adoption and 87% of the total effect on the increase in manufacturing employment. These findings suggest that electric motors, with their significantly lower fixed costs compared to steam engines, reduced entry barriers in the manufacturing sector, thereby stimulating manufacturing activities.

In the last part of the analysis, I examine whether the timing of electricity access changes the trajectory of regional development in the long run. Using population data from 1908 to 1935, I find that municipalities with early electricity access experienced substantial population growth even during the period of grid expansion in the other areas. The estimation results indicate that gaining electricity access one year earlier led to a 10% increase in population growth between 1908 and 1935. This disparity in regional growth suggests that the rapid increase in entrant activities, stimulated by the technological transition from steam engines to electric motors, generated agglomeration forces in manufacturing, leading to a lasting advantages in subsequent regional development.

Finally, to investigate the persistent impacts of this technological shock, I examine its effects on today's economic activities using 21st-century firm-level data. The results reveal that municipalities with earlier electricity access continue to exhibit greater economic activity: they host more firms, have higher employment levels, achieve greater average sales, and demonstrate higher productivity as measured by sales per employee. These findings suggest that the regional advantages of earlier technological change have persisted over time through agglomeration forces, resulting in a lasting impact on economic activities even a century later.

**Related Literature and Contribution** This study brings new insights to the literature on the historical impact of electrification by focusing on the technical change from steam engines to electric motors.<sup>3</sup> Previous work has examined the effects of electricity access or the construction of power stations on various economic outcomes, such as agricultural productivity (Kitchens and Fishback, 2015; Lewis and Severnini, 2020), health conditions (Lewis, 2018; Clay et al., 2024), and labor conflict (Molinder et al., 2021). Notably, using census of population, Leknes and Modalsli (2020) and Gaggl et al. (2021) find that electrification spurred manufacturing activities but

<sup>&</sup>lt;sup>3</sup>This paper also relates to the literature evaluating the impacts of electricity access in developing countries today. In contrast to the studies in the historical context during the Second Industrial Revolution, previous research has found mixed evidence. Some research find substantial impacts of electricity access (Dinkelman, 2011; Rud, 2012; Lipscomb et al., 2013; Fried and Lagakos, 2023; Kassem, 2024), whereas others estimate modest welfare gains (Lee et al., 2020; Burgess et al., 2023; Burlig and Preonas, 2024). In relation to my work, Kassem (2024) attributes the positive effects of electricity access in Indonesia to increased firm turnover, highlighting the role of firm dynamics in the benefits of electrification.

decreased the share of agricultural employment, driving structural transformation during the Second Industrial Revolution. While most of the literature examines the effects of electrification broadly, recent work by Reichardt (2024) specifically focuses on the transition from steam engines to electric motors.<sup>4</sup> He associates this transition with a decrease in the average establishment size and a reduction in wealth inequality, utilizing state-by-industry statistics in the U.S. and inheritance tax data in the Netherlands, respectively. Reichardt (2024) provides a theoretical framework highlighting the significant role of electric motors, particularly due to their much lower fixed costs compared to steam engines, in encouraging entrepreneurship and reshaping socioeconomic structures.<sup>5</sup> In contrast to existing studies, this paper contributes to the literature by using establishment-level data and providing the first empirical evidence that the *new entrants* played a crucial role in the technological transition from steam engines to electric motors and in stimulating manufacturing activities. These findings underscore the micro-level mechanisms driving structural transformation and socioeconomic change during the Second Industrial Revolution.

In addition, this paper contributes to our understanding of the evolution of the geography of economic activities. While several studies highlight the significant role of geographical fundamentals in shaping the spatial distribution of economic activities (e.g., Davis and Weinstein, 2002, 2008; Bosker et al., 2013; Bakker et al., 2021), there is also substantial evidence that temporary shocks can result in persistent or even permanent shifts in these spatial patterns (e.g., Redding et al., 2011; Bleakley and Lin, 2012; Kline and Moretti, 2014; Hanlon, 2017). Within this literature, this paper is closely related to studies that investigate the long-run impact of specific technological shocks on the spatial evolution of economic activities, which include studies on plough (Alesina et al., 2013), printing press (Dittmar, 2011), steam engine (Yamasaki, 2023) and tractors (Kitamura, 2022). This paper is distinct from these previous studies in two ways. First, I shed light on the transition from steam engines to electric motors, a technological shift that profoundly affected manufacturing activities of establishments of all sizes. Second, and most importantly, this research empirically investigates the extent to which the spatial difference in the timing of technological change influences the trajectory of regional development. Specifically, the findings from the long-run analysis suggest that the regions that were able to adopt electric motors early on enjoyed a lasting advantage in subsequent development. The finding is consis-

<sup>&</sup>lt;sup>4</sup>As related work, Goldin and Katz (1998) argue that the adoption of electric motors increased the relative demand for skilled workers by enabling a shift to continuous process and batch production methods. Building on this argument, Kawaguchi et al. (2024) exploit establishment-level data from the silk-weaving industry in Japan to assess the impact of electrification on skill demand and wage structures.

<sup>&</sup>lt;sup>5</sup>Reichardt (2024) defines *scale bias* as the degree to which technical change affects the relative productivity of large and small firms. Based on this definition, he demonstrates that the transition from steam engines to electric motors represents a *small-scale-biased* technical change. This is because electric motors, which involve lower fixed costs compared to steam engines, stimulate entrepreneurship and lead to a reduction in the average size of firms.

tent with the mechanism that technological shocks in the manufacturing sector accumulate over time, influencing the long-run pattern of regional development (Desmet and Rossi-Hansberg, 2009; Michaels et al., 2012).<sup>6</sup>

Finally, this paper contributes to studies on industrialization in Japan, which saw unprecedented growth in manufacturing activities during the early 20th century. Previous research has explored various drivers of Japan's industrialization, including modern institutions (Sussman and Yafeh, 2000), the modern banking system (Tang and Basco, 2023), international trade liberalization (Bernhofen and Brown, 2004, 2005), government subsidies to firms (Morck and Nakamura, 2018), technological advancements in the cotton spinning industry (Braguinsky et al., 2021), railways (Tang, 2014; Yamasaki, 2023), secondary school (Ichimura et al., 2024), and technology absorption (Juhász et al., 2024). While few studies have specifically assessed the role of electricity access in Japan's industrialization, Minami (1979) describes the transition from steam engines to electric motors, arguing that electric motors, with their simpler layouts, favored the growth of small-scale manufacturing activities. This paper provides empirical support for Minami (1979)'s argument through causal assessment and extends it by examining to what extent electricity access contributed to the rise of manufacturing activities. Moreover, I have successfully harmonized the municipality transitions from 1900 to 2020 by leveraging various data sources, allowing for a detailed spatial analysis of long-term effects.<sup>7</sup> To the best of my knowledge, this is the first study to analyze pre-war Japan at the municipality-by-year level.

The rest of the paper is structured as follows. Section 2 describes the historical context and data. Section 3 discusses the empirical strategy and two sets of evidence that motivate it. In Section 4, I present the short-run effects of electricity access on manufacturing activities. Then, Section 5 shows the long-run effects of early electricity access on population dynamics and to-day's economic activities. Finally, Section 6 concludes.

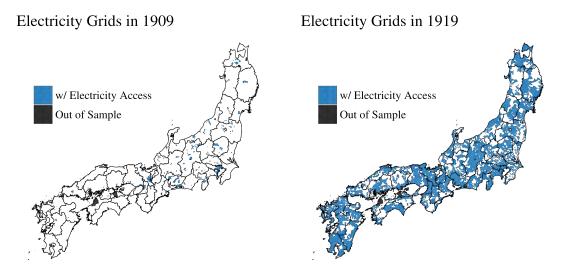
### 2 Historical Background and Data

This section describes the historical background of the expansion of electric grids in early 20thcentury Japan and the resulting transition from steam engines to electric motors in the manufacturing sector (Subsection 2.1). It then explains how I constructed the municipality-level dataset

<sup>&</sup>lt;sup>6</sup>In this literature, several studies discuss the mechanisms underlying the spatial dynamics of technological leadership (Brezis et al., 1993; Brezis and Krugman, 1997; Rosenberg and Curci, 2023; Hornbeck et al., 2024; Berkes et al., 2024). For example, Brezis et al. (1993) attribute these dynamics to investment accumulation in old technologies, which can make new technologies less attractive. In this context, this paper provides empirical evidence that the timing of electricity access can alter the spatial pattern of technological leadership through entrants with new technologies.

<sup>&</sup>lt;sup>7</sup>Since spatial scale can matter when examining the persistence of the effects of shocks (Lin and Rauch, 2022), municipality-level analysis provides a more granular understanding of the long-term effects.

### Figure 1: Expansion of Electricity Grids in Japan



**Notes:** These maps show the municipality-level status of electricity access in 1909 (left) and 1919 (right). "w/ Electricity Access" indicates the municipalities where electricity supply had started by the year, and "Out of Sample" refers to those excluded from the analysis due to missing data, such as electricity access or population information. The black line represents the prefecture boundary. **Source:** Ministry of Communications (1910, 1920)

that captures electricity supply status and manufacturing activities, along with summary statistics for the dataset (Subsection 2.2).

#### 2.1 Historical Background

**Expansion of Electricity Grids in Japan** In 1883, Tokyo Electric Co. (Tokyo Dento), the first electric utility company in Japan, was founded and began supplying electricity in Tokyo. Following its establishment, several other electric utility companies emerged to supply electricity in metropolitan areas such as Tokyo, Kyoto, and Osaka. These companies were involved in generating, transmitting, and distributing electricity to their customers, primarily catering to the demand for lighting. Initially, they relied on small-scale thermal power plants near their customer bases. The Japanese government implemented a licensing system in 1896 as the electric supply industry gradually expanded. This system required companies seeking to enter the electric utility business to obtain a government-issued license, which delineated their service areas (Research Committee on Electric Utility Policy ed., 1965).

After 1905, there was a significant expansion in electricity supply areas, primarily driven by hydroelectric power generation. Figure 1 displays the municipality-level status of electricity access in 1909 and 1919, illustrating there was a rapid expansion of electricity grids during this period. Kurihara (1964) identifies two main reasons for this rapid expansion: the lower generation costs of hydroelectric stations and transmission technology development. First, hydroelect-

tric stations could produce electricity at a lower cost than thermal power plants. In Osaka and Tokyo, where thermal power was the primary source in 1900, electricity prices were about 1.5 to 3 times higher compared to Kyoto and Fukushima, where hydroelectric power generation predominated. Also, Japan's unique topography—characterized by mountainous terrain and fast-flowing rivers—was well-suited for hydropower generation. Second, while hydropower generation is geographically restricted to mountainous areas, significant improvements in transmission technology during the 1900s made it possible to supply electricity generated by hydropower plants over wider areas.<sup>8</sup> This technological advancement led to a dramatic increase in electricity demand. Figure A1 displays the total amount of electricity generated by hydropower and thermal stations. It shows that electricity generated by hydropower plants began to increase rapidly around 1907, aligning with Kurihara (1964)'s rationale for the grid expansion.

**Technical Change: From Steam Engine to Electric Motor** The steam engine, a hallmark technology of the Industrial Revolution, was first introduced in Japan in the 1860s with the establishment of a metal-producing factory by the Tokugawa Shogunate. Subsequently, private sectors, such as the weaving and coal-mining industries, adopted steam power (Minami, 1979). As illustrated in Figure A2, by 1900, steam engines accounted for nearly 90% of the total horse-power used in the manufacturing sector.

Despite the significant shift from human power and water wheels to steam engines, the high fixed costs associated with steam engine adoption created barriers to their widespread use. As Minami (1979) highlights, implementing steam engines not only complicated production processes but also required more extensive and robust workshops. An inability to transmit power over long distances necessitated the centralization of machines in specific locations, leading to the factory system where machines were grouped together (*group drive system*). In this production system, power generated by steam engines was transmitted via shafts and belts affixed to the roof. Figure A3 illustrates an ironworks factory powered by steam engines, showing a giant steam engine, long shafts, and roof-mounted belts. This production system required sizable and sturdy workshops, significantly increasing the fixed costs of establishing steam-powered factories.

In contrast, electricity offered greater flexibility, as it could be easily transmitted to distant machines through electric cables, allowing for the installation of smaller electric motors. This salient advantage of electric motors facilitated the organization of production systems, called the *unit drive system*. Unlike steam engines that required extensive and complex workshops, this new production system enabled factories to operate in simpler and more compact spaces. According to Tanaka (1916), electric motors allowed for a reduction in workshop space to less than one-

<sup>&</sup>lt;sup>8</sup>In 1914, Inawashiro Hydro Power Co. successfully transmitted 37,500 kW of electricity from hydropower plants in Fukushima to Tokyo areas, which was 228 km long and the third longest transmission line in the world.

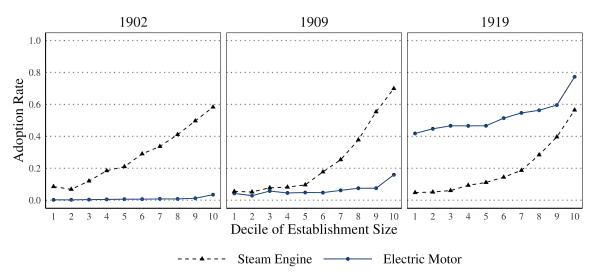


Figure 2: Technology Adoption by Establishment Size

**Notes:** These figures display the adoption rate of steam engines and electric motors by establishment size in 1902 (left), 1909 (center), and 1919 (right), where we define the number of workers as a measure of establishment size. Each point represents the average adoption rate among establishments in each decile bin. Establishments with 10 or more workers in all manufacturing industries are included in the Factory Catalog. **Source:** Ministry of Agriculture and Commerce (1904, 1911, 1921)

tenth of that needed for steam-powered factories. This anecdote suggests that establishing an electric-powered factory would entail significantly lower fixed costs, provided that an electric utility company supplied electricity.<sup>9</sup>

Figure 2 compares the adoption rates of steam engines and electric motors across various establishment sizes and different phases of electricity grid expansion, reinforcing the arguments and anecdotes introduced above. First, throughout all periods, smaller establishments were less likely to adopt steam engines. This suggests that the substantial fixed costs associated with steam engines likely discouraged smaller establishments from establishing steam-powered factories. Second, after the grid expansion (1909 and 1919), establishments began adopting electric motors regardless of their size.<sup>10</sup> This indicates that access to purchased electricity was crucial for most establishments, as it relieved them of the burden of generating their own power, thereby facilitating the broader adoption of electric motors. Consequently, by the middle phase of grid expansion in 1919, about half of the small and medium-sized establishments had adopted electric motors, suggesting the popularization of powered factories. These trends in adoption rates of steam engines and electric motors also apply within individual industries. Figure A4 provides examples

<sup>&</sup>lt;sup>9</sup>Reichardt (2024) estimates the annualized cost of operating a 50-horsepower steam engine to be 3 to 4 times the annual wage of an unskilled worker, while the equivalent cost for an electric motor is only 2% of an unskilled worker's annual wage.

<sup>&</sup>lt;sup>10</sup>The high adoption rate of electric motors among the top decile of establishments across all periods suggests that only the largest establishments were able to generate electricity in-house to power their electric motors.

of adoption rates for the textile and machinery industries.

#### 2.2 Data

To investigate the effect of electricity access on manufacturing activities and population dynamics, I newly digitized various sources of official records and constructed a municipality-level dataset that covers the entirety of Japan. Table 1 lists the data sources used in this study, which I explain below.

Description	Data Source
Electricity supply information in 1909, 1914, 1919, 1924, and	Ministry of Communications (1910, 1915, 1920,
1929	1926, 1930)
Location of hydroelectric power stations in 1930	Ministry of Communications (1930)
Establishment information in 1902, 1909, 1916, and 1919	Ministry of Agriculture and Commerce (1904,
	1911, 1918, 1921)
Population in 1908, 1913, 1918, 1920, 1925, 1930, and 1935	Bureau of Statistics (1908, 1913, 1918, 1920, 1925,
	1930, 1935)
Firm information from 2012 to 2019	Orbis (2012-2019)
Hydropower potential, Streamflow	Arai et al. (2022)
Municipality boundary in 1920, ruggedness, coastal line, and	Ministry of Land, Infrastructure, Transport and
railway stations	Tourism (2024)
Municipality transition from 1900 to 2020	Higashide (2024)
Representative point of municipality	Center for Open Data in the Humanities (2024)

Table 1: Data Sources

**Spatial Units** The spatial unit of analysis in this study is the municipality. While other studies on entire Japan have used prefectures or counties as the spatial unit (e.g., Tang, 2014; Yamasaki, 2023), analyzing at the municipality level provides a more granular understanding of the evolution of economic geography, which is particularly crucial when examining the persistent effects of a shock (Lin and Rauch, 2022). Given that there were some municipality merges and splits during the period of analysis (see Figure A5), I combined multiple data sources and successfully harmonized the municipality transitions from 1900 to 1940 (Center for Open Data in the Humanities, 2024; Higashide, 2024).<sup>11</sup> In all analyses throughout this paper, I use the harmonized municipality unit, which represents the most aggregated unit from 1900 to 1940.

**Information on Electricity Supply** To obtain information on electricity supply, I collected and digitized various issues of the Handbook of Electric Utility Industry (*Denki Jigyo Yoran*), published by the Ministry of Communications.<sup>12</sup> This publication, first released in 1908 (for the 1907 issue), contains municipality-level licensing information on electricity supply companies To

<sup>&</sup>lt;sup>11</sup>I also harmonized the municipality transitions from 1940 to 2020 for a validity check, although this was not used in the main analysis.

<sup>&</sup>lt;sup>12</sup>Figure A6 shows a sample page from the Handbook of Electric Utility Industry.

align with the survey years of the Census of Manufactures, I constructed datasets for the years 1909, 1914, 1919, 1924, and 1929. Additionally, I digitized the locations of hydroelectric power stations over 2,000 kW in 1930 from the same source.

**Establishment-Level Data** I collected and digitized establishment-level information from the Factory Catalog (*Kojo Tsuran*), based on the Census of Manufactures and published by the Ministry of Agriculture and Commerce.<sup>13</sup> This official record covers establishments with over ten workers and includes information on the number of workers, horsepower by type of power source (e.g., water wheel, steam engine, electric motor), establishment date, address, and industry.<sup>14</sup> This series of official records includes 7,120 establishments in 1902, 14,175 in 1909, 17,540 in 1916, and 23,013 in 1919.

**Population** Municipality-level population data was obtained from several official records published by the Bureau of Statistics: the Table of Registered Population (*Nihon Teikoku Seitai Jinko Tokei*) in 1908, 1913, and 1918, and the Population Census in 1920, 1925, 1930, and 1935.

**Firm-level Data for Long-run Analysis** To examine the persistent effects on today's economic activities, I use firm-level data from Orbis. To exclude the effects of the Covid-19 pandemic, I restrict the sample period to 2012-2019. The dataset includes information on tax ID, postal code of headquarters, NACE Rev.2 industry code, employment, and sales. I drop observations without a postal code, industry code, tax ID, or at least one sales record between 2012 and 2019. Using postal codes, I link the firm addresses to the harmonized municipality unit I constructed. After excluding irrelevant samples, the analysis includes 1,195,319 unique firms.

**Other Supplemental Data** I define the center point of each municipality as its representative point, based on data obtained from Center for Open Data in the Humanities (2024). For geographical information, I downloaded 250m mesh data from Ministry of Land, Infrastructure, Transport and Tourism (2024) and calculated the average ruggedness for each municipality. In addition, I obtained coastal line and railway station locations from the same source and calculated the distance from each municipality center point to the nearest coastal line and railway station, respectively.

**Summary Statistics** Table A1 presents the summary statistics of the main variables used in this study. After harmonizing the municipalities, the number of municipalities included in the analysis is 10,429. The table shows the rapid expansion of the electricity grid in early 20th-century Japan: in 1909, only 4% of municipalities had electricity access, but this figure rose to 26% by 1914

<sup>&</sup>lt;sup>13</sup>Okazaki et al. (2019) and Yamasaki (2023) also use this data source.

<sup>&</sup>lt;sup>14</sup>Ministry of Agriculture and Commerce (1911) covers establishments with over five workers, so I excluded those with fewer than nine workers from the analysis for consistency.

and 93% by 1924. Also, the table indicates that in 1909, the steam engine was the most dominant power source, while the number of establishments using electric motors was relatively small.

### **3** Empirical Strategy

This section outlines the methodology used to identify the causal effect of electricity access on regional economic activities. To begin, I introduce hydropower potential as an instrumental variable for electricity access (Subsection 3.1). Next, I present two sets of evidence that motivate the identification strategy (Subsection 3.2). The first evidence is that hydropower potential drives the construction of hydropower stations, facilitating early access to electricity. The second one is that hydropower potential influences manufacturing activities only after the expansion of electricity grids. Together, these facts reinforce the assumptions of exclusion restriction and relevance condition required for the validity of the instrument.

### 3.1 IV: Hydropower potential

This paper employs municipalities' hydropower potential, based on natural geographical characteristics, as an instrumental variable for electricity access. As described in the historical background section, the expansion of electricity grids in early 20th-century Japan was predominantly driven by hydropower generation. Therefore, hydropower potential is expected to be a plausible predictor of electricity access. Specifically, I employ the hydropower potential of *run-of-river* hydroelectric power generation as the instrument. Unlike storage hydroelectric systems that require large reservoirs, such as dams, run-of-river hydroelectricity harnesses the natural flow of rivers. Because this method requires less infrastructure investment and is well-suited to Japan's topography—characterized by mountainous terrain and fast-flowing rivers—it became widespread during the early 20th century (Kurihara, 1964).

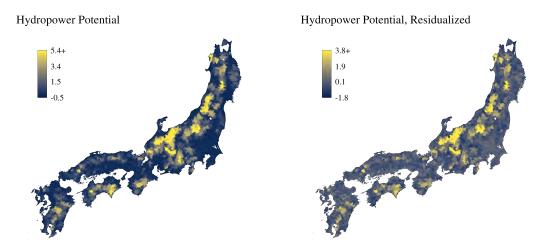
In line with the hydraulic engineering literature (Basso and Botter, 2012; Müller et al., 2014; Arai et al., 2022), the theoretical hydropower potential of run-of-river hydroelectric power generation in each basin j is calculated as the product of the water volume and the hydraulic head height of the basin:

Hydropower Potential<sub>*i*</sub> = Water Volume Index<sub>*i*</sub> 
$$\times$$
 Hydraulic Head Height<sub>*i*</sub>. (1)

In Equation (1), Water Volume Index<sub>j</sub> is defined as the cumulative annual flow volume of basin j. <sup>15</sup> Additionally, Hydraulic Head Height<sub>j</sub> is calculated as the difference between the minimum

<sup>&</sup>lt;sup>15</sup>Specifically, Water Volume Index<sub>j</sub> is measured as the cumulative annual flow up to the 95th highest daily flow in a year. The design discharge ( $Q_D$ ), which represents the *D*th highest daily flow in a year, determines the optimal turbine size (Gernaat et al., 2017). Setting  $Q_D$  to about the 95th highest daily flow (i.e.,  $Q_{95}$ ) is generally regarded as a suitable criterion when calculating hydropower potential (Kao et al., 2014). Note that Water Volume Index<sub>j</sub> defined

### Figure 3: Geographical Distribution of Hydropower Potential



**Notes:** These maps illustrate the geographical distribution of the estimated hydropower potential at the municipality level, standardized with a mean of zero and a standard deviation of one. The left panel displays the distribution of *raw* hydropower potential, while the right panel shows the distribution of *residualized* hydropower potential after controlling for baseline municipality characteristics. These characteristics include area size (in log), distance to the coast (in log), distance to the nearest metropolis (in log), population density in 1908 (in log), streamflow, ruggedness, and prefecture fixed effects. **Source:** Arai et al. (2022)

elevation of basin *j* and the minimum elevation within a 1 km radius. Due to the lack of detailed streamflow data across Japan, I rely on the estimated streamflow data calculated by Arai et al. (2022) to measure hydropower potential. Arai et al. (2022) developed a neural network model that uses natural geographical characteristics, such as precipitation, temperature, and elevation from gauged basins, as training data to predict streamflow for small-sized basins (approximately 10 km<sup>2</sup>) throughout Japan. Given the potential influence of modern infrastructure, such as upstream dams or hydropower stations, on streamflow, Arai et al. (2022) excluded basins affected by these factors from their training data.

I calculated the hydropower potential at the municipality level by maximizing the potential of all basins within each municipality. Figure 3 illustrates the spatial distribution of the hydropower potential. The left panel displays the *raw* hydropower potential, while the right panel shows the *residual* hydropower potential after controlling for baseline municipality characteristics, such as area size, ruggedness, and streamflow. Although the potential tends to be higher in the Chubu region, where the Japanese Alps are located, municipalities with high hydropower potential are dispersed throughout the country. In addition, some mountainous areas, such as the eastern Fukushima and Chugoku regions, exhibit lower hydropower potential, confirming that the variations in this index stem from the interaction of water volume and hydraulic head height.

here corresponds to the cumulative water volume available for energy production when the design streamflow is set to be  $Q_{95}$ .

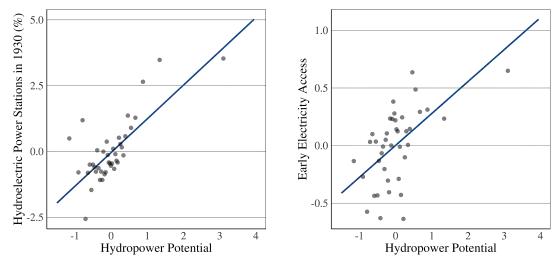


Figure 4: Hydropower Potential, Hydroelectric Generation, and Early Electricity Access

**Notes:** These panels show the binned scatter-plots between the hydropower potential and the probability of having hydroelectric power stations over 2,000 kW capacity in 1930 (left) and the timing of electricity access, defined as 1929 minus the year of the first electricity access (right). The unit of observation is the municipality where the electricity supply began after 1909. "Hydropower Potential" is a standardized measure of municipality-level potential for hydropower generation, with standard deviation of one. All values are residualized by controlling for the baseline municipality characteristics: the area size (in log), the distance to the coast (in log), the distance to the metropolis (in log), population density in 1908 (in log), streamflow, ruggedness, and prefecture fixed effects. The solid lines present the linear approximation of the relationship.

#### 3.2 Validity of the instrument

### The higher hydropower potential, the earlier electricity access

The underlying rationale of using hydropower potential as an instrumental variable for electricity access is that hydropower potential leads to electricity access through the construction of hydropower stations. Figure 4 supports this relevance condition. The panels of Figure 4 display a binned scatter plot showing the relationship between hydropower potential, the probability of having hydroelectric power stations in 1930, and the timing of electricity access, with values residualized by controlling for baseline municipality characteristics. The left panel shows a positive relationship, indicating that municipalities with higher hydropower potential were more likely to host hydroelectric power stations. In addition, the positive relationship in the right panel suggests that municipalities with greater hydropower potential gained electricity access earlier. These results are robust to controlling for streamflow and ruggedness (see Table A3). These findings confirm that hydropower potential is a strong predictor of earlier electricity access.

### Hydropower potential matters only after the grid expansion

The other key identification assumption when using hydropower potential as an instrument is that hydropower potential affects manufacturing activities only through its impact on electricity access, conditional on local municipality characteristics (e.g., ruggedness, streamflow, and population density). To support this exclusion restriction assumption, I investigate the timing of when hydropower potential began to influence manufacturing activities. If hydropower potential only affected manufacturing activities after the expansion of electricity grids, it would confirm that the instrument is exogenous to preexisting economic factors driving manufacturing growth.

To examine the relationship between hydropower potential and manufacturing activities, I employ the following specification:

$$Y_{it} = \sum_{t \neq 1909} \beta_t \text{ Hydropower Potential}_i \times \mathbf{1}\{\text{Year} = t\} + \sum_{t \neq 1909} \lambda_t \ln(\text{PopDens}_{i,1908}) \times \mathbf{1}\{\text{Year} = t\} + \sum_{t \neq 1909} \gamma_t \text{ Geography}_i \times \mathbf{1}\{\text{Year} = t\} + \alpha_i + \delta_t + \upsilon_{it},$$
(2)

where *i* and  $t \in \{1902, 1909, 1916, 1919\}$  denote the municipality and year, respectively. To make the interpretation of the coefficients straightforward, I restrict the sample to municipalities where electricity access began after 1909. The outcome variable of interest,  $Y_{it}$ , represents the number of manufacturing establishments in municipality i in year t.<sup>16</sup> The main explanatory variable, Hydropower Potential, is a standardized measure of the municipality's potential for run-of-river hydropower generation, with a mean of zero and a standard deviation of one. To estimate the time path of how hydropower potential influenced manufacturing activities, I interact the hydropower potential with binary indicators for each year, using 1909 as the reference year. Since the expansition of electricity grid was predominantly driven by hydropower generation starting around 1907 (see Figure A1), and I exclude municipalities that gained electricity access before 1909, it is expected that hydropower potential would affect manufacturing activities only after 1909. The specification includes the municipality fixed effects ( $\alpha_i$ ) and year fixed effects ( $\delta_t$ ). Additionally, the model allows pre-electricity access population density and geographical characteristics—such as area size, distance to the coast, and distance to the nearest metropolis-to have a time-varying effect on the outcome. The former ensures that the population convergence or divergence pattern do not drive the results.<sup>17</sup> The latter helps to avoid misinterpreting the effects of advancements in international trade and urbanization as those of hydropower potential. Standard errors are clustered at the municipality level to account for serial correlation. Each coefficients,  $\beta_i$ , estimates

<sup>&</sup>lt;sup>16</sup>Since many municipalities records zero establishments, the outcome variable is not log-like transformed, such as log(Y + 1) or arcsinh(Y), to avoid sensitivity to unit changes (Chen and Roth, 2023).

<sup>&</sup>lt;sup>17</sup>While the literature documents a negative correlation between past population size and subsequent population growth in pre-modern economies (e.g., Dittmar, 2011; Glaeser et al., 2014), other studies find that larger cities grow more rapidly when located near railroads (Bogart et al., 2022; Yamasaki, 2023). Thus, it is ambiguous *ex ante* in which direction population density affects regional economic activities, such as population and manufacturing growth.

		Number of Establishments							
		Total		w/ Electric Motor					
	(1)	(2)	(3)	(4)	(5)	(6)			
Hydropower Potential $\times$ 1902	-0.024	-0.020	-0.004	-0.001	-0.001	-0.001			
	(0.022)	(0.023)	(0.023)	(0.001)	(0.001)	(0.001)			
Hydropower Potential $\times$ 1916	0.015	0.023	0.018	$0.047^{***}$	$0.044^{***}$	0.040***			
	(0.016)	(0.016)	(0.017)	(0.007)	(0.007)	(0.008)			
Hydropower Potential $\times$ 1919	$0.091^{**}$	$0.090^{**}$	$0.080^{**}$	$0.101^{***}$	0.093***	$0.081^{***}$			
	(0.036)	(0.037)	(0.038)	(0.014)	(0.013)	(0.013)			
Municipality FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$			
Year FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$			
Geography × Year FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$			
Pop. density $1908 \times \text{Year FE}$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$			
Streamflow $\times$ Year FE		$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$			
Ruggedness $\times$ Year FE			$\checkmark$			$\checkmark$			
Observations	40,020	40,020	40,020	40,020	40,020	40,020			
Adjusted R <sup>2</sup>	0.68	0.68	0.68	0.34	0.34	0.34			
Mean of dep.var	0.72	0.72	0.72	0.13	0.13	0.13			

Table 2: Hydropower Potential and Manufacturing Activities

**Notes**: This table presents the effects of hydropower potential on manufacturing activities and electric motor adoption. Observations are municipalities where the electricity supply began after 1909. Robust standard errors clustered at the municipality level are reported in parentheses. The dependent variable "Total" and "w/ Electric Motor" represent the total number of establishments and the number of establishments using electric motors, respectively. The independent variable, "Hydropower Potential", is a standardized measure of municipality-level potential for hydropower generation, with standard deviation of one, thus the estimates reflect differences in economic activities with one standard deviation higher hydropower potential. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

the increase in the number of establishments caused by higher hydropower potential in a given year, j, relative to 1909.

Table 2 presents the estimation results. Columns (1)-(3) display the effect of hydropower potential on the total number of establishments, while Columns (4)-(6) focus specifically on establishments using electric motors. Consistent with the historical expansion of electricity grids, driven by hydropower generation beginning around 1907, I find that municipalities with higher hydropower potential experienced larger increase in the number of establishments only from 1916 onward, with no significant effects observed between 1902 and 1909. In all columns, the impact of hydropower potential becomes more pronounced after 1909, and the effects are statistically significant after 1916 for establishments with electric motors and after 1919 for the total number of establishments. Furthermore, as Table 2 indicates, these results are robust to controlling for time-varying trends in streamflow and ruggedness, suggesting that the hydropower potential, the interaction between streamflow and ruggedness, plays a crucial role in driving manufacturing

activities after the expansion of electricity gird.

Overall, there is a consistent absence of pre-trends, and a consistent effect of hydropower potential on manufacturing growth after 1916. These findings indicates that hydropower potential provides a plausible means to obtain variation in electricity access that is exogenous to preexisting economic determinants of manufacturing growth. Moreover, to address concerns that hydropower potential may have led to the use of water wheels prior to the expansion of electricity grids (Hornbeck et al., 2024), which could have influenced manufacturing activities after grid expansion, I verify that hydropower potential has no significant effect on the number of establishments using water wheels before and after the grid expansion (see Table A2).

### 4 Result: Short-run effect

In this section, I analyze the short-run impact of electricity access on manufacturing activities. After outlining the baseline specification, Subsection 4.1 presents the estimation results, demonstrating that electricity access significantly boosted manufacturing activities. Additionally, a series of robustness checks confirms that these effects were not influenced by preexisting regional characteristics or other confounding factors, such as railway access or infrastructure investments (Subsection 4.2). Lastly, Subsection 4.3 documents that the increase in manufacturing activities was primarily driven by new entrants, particularly those adopting electric motors.

#### 4.1 Main result

To estimate the short-run effect of electricity access on manufacturing activities, I examine the extent to which electricity access in 1914 affected manufacturing activities between 1909 and 1919. The main specification is as follows:

$$\Delta Y_{ip} = \eta \text{ Electricity Access}_{i,1914} + \theta \ln(\text{PopDens}_{i,1908}) + \pi \text{ Geography}_i + \tau_p + \varepsilon_{ip}, \qquad (3)$$

where *i* and *p* express the municipality and prefecture, respectively.  $Y_{ip}$  represents changes in manufacturing activities, such as the number of establishments and manufacturing employment, between 1909 and 1919.<sup>18</sup> Electricity Access<sub>*i*,1914</sub> is a dummy variable indicating whether the municipality had electricity access in 1914. Thus, the coefficient of interest,  $\eta$ , captures the effect of electricity access in 1914 on manufacturing activities between 1909 and 1919. Control variables include population density in 1908,  $\ln(\text{PopDens}_{i,1908})$ , and a set of local geographic characteristics, Geography<sub>*i*</sub>. Prefecture fixed effects,  $\tau_p$ , account for prefecture-specific trends. I also estimate Conley (1999) standard errors, which adjust for spatial correlation across municipalities, assuming that municipalities are independent beyond a 30 km distance cutoff. To simplify the in-

<sup>&</sup>lt;sup>18</sup>Since many municipalities report zero establishments, the outcome variable is not log-transformed to avoid sensitivity to unit changes (Chen and Roth, 2023).

	$\Delta$ Num	ber of Establis	1909-1919)	Demog	raphics	
	Total (1)	w/ Electric Motor (2)	Total (3)	w/ Electric Motor (4)	Δ Mnf. Workers (1909-1919) (5)	Δ Pop. (1908-1918) (6)
Electricity Access in 1914	0.307*** (0.090)	0.559*** (0.064)	2.00 <sup>**</sup> (1.02)	1.29*** (0.404)	121.7*** (43.3)	165.6 (371.8)
Model	OLS	OLS	IV	IV	IV	IV
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Streamflow	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Ruggedness	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	10,005	10,005	10,005	10,005	10,005	9,991
First stage F-stat			65.9	65.9	65.9	66.7
Mean of dep.var	0.30	0.36	0.30	0.36	24.7	228.1

Table 3: Main results: Effect of Electricity Access on Industrialization

**Notes**: This table presents the effects of electricity access in 1914 on manufacturing activities, electric motor adoption, and demographics, estimated using OLS and IV methods. For IV regressions, the second-stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Electricity Access in 1914" and the instrument is the "Hydropower Potential". Robust standard errors clustered by municipalities within 30km radius, following Conley (1999), are reported in parentheses. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

terpretation of coefficients, the sample is restricted to municipalities that gained electricity access after 1909.

Given that private electric utility companies were responsible for supplying electricity in early 20th-century Japan, it is possible that local demand factors drive the expansion of electricity supply. To address this potential endogeneity, I use hydropower potential, as introduced in Section 3, as an instrumental variable for electricity access in 1914. Columns (1)-(3) of Table A3 present the first-stage estimates, showing that a one standard deviation increase in hydropower potential is associated with a 4.1% higher likelihood of electricity access in 1914. This result holds even after controlling for natural geographic characteristics, such as streamflow and ruggedness. The F-statistic for the first stage is 65.9.

Table 3 presents the estimation results of the baseline specification. Across all OLS and IV specifications, the effect of electricity access on changes in manufacturing activities is positive, substantial, and statistically different from zero. There are two noteworthy results in Table 3. First, as shown in column (3), electricity access led to an increase of two establishments per municipality, which is approximately 6.6 times larger than the average increase. In addition, as column (4) shows, it also stimulated the adoption of electric motors. Second, columns (5) and

(6) indicate that electricity access led to a significant increase in the number of manufacturing workers but had no effect on population growth. These results suggest that the increase in manufacturing employment was driven by those who started to engage in the manufacturing sector, rather than by an influx of workers from other municipalities.

Comparing the OLS and IV estimates in Table 3, we observe that the IV estimates of the effects of electricity access are substantially larger than the OLS estimates. Two potential reasons could explain this downward bias in the OLS estimates relative to the IV estimates, both of which are related to the compliers in the IV strategy. First, the difference between the OLS and IV estimates may be driven by imbalanced industry composition. Due to the construction of hydropower potential, municipalities with higher potential are often located in mountainous areas where small-scale industries, such as textiles and food manufacturing, are prevalent. In contrast, large-scale industries like steel, machinery, and chemical manufacturing tend to be located in flat, coastal regions to minimize transportation costs. As a result, the compliers in the IV strategy may represent regions with more small-scale industries compared to the OLS sample, leading to larger estimates.<sup>19</sup> Second, differences in the initial development levels of the municipalities may also contribute to the gap between the OLS and IV estimates. Since the compliers in the IV strategy are likely located in less developed regions, they may have more room for manufacturing growth.

#### 4.2 Robustness

In order for the estimates presented in Subsection 4.1 to be valid, it is essential to ensure that the results are not influenced by (i) unobserved preexisting regional characteristics and (ii) timevarying confounding factors that emerged after the expansion of the electricity grid. To address these concerns, I perform a series of robustness checks.

**Placebo test** I begin by addressing the concern that municipalities that gained electricity access in 1914 may have followed a different trajectory in manufacturing activities, possibly due to their suitability for water wheel use. Although Subsection 3.2 confirms that hydropower potential had no significant effect on manufacturing activities before the expansion of the electricity grid, I conduct a placebo test to further allays concerns about identification. In this test, shown in Table 4, the dependent variable is replaced with changes in manufacturing activities between 1902 and 1909, while the treatment variable remains a dummy indicating electricity access in 1914. Since the observations are limited to municipalities without electricity access in 1909, we expect that electricity access in 1914 would have no effect on changes in manufacturing activities between 1902 and 1909.

The results in Table 4 confirm this expectation. First, as shown in columns (1) and (2), the

<sup>&</sup>lt;sup>19</sup>Additionally, Glaeser et al. (2015) document that industries with significant returns to scale, such as steel, can dampen entrepreneurial activities in a region.

	$\Delta$ Num	ber of Establis	shments (	1902-1909)	Demographics
	Total (1)	w/ Electric Motor (2)	Total (3)	w/ Electric Motor (4)	Δ Mnf. Workers (1902-1909) (5)
Electricity Access in 1914	0.395*** (0.083)	0.004 <sup>**</sup> (0.002)	0.176 (0.693)	0.012 (0.016)	24.4 (28.0)
Model	OLS	OLS	IV	IV	IV
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Streamflow	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Ruggedness	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	10,005	10,005	10,005	10,005	10,005
First stage F-stat			65.9	65.9	65.9
Mean of dep.var	0.33	0.004	0.33	0.004	10.5

Table 4: Falsification: Effect of Electricity Access on Industrialization

**Notes**: This table presents the effects of electricity access in 1914 on manufacturing activities, electric motor adoption, and demographics, estimated using OLS and IV methods. For IV regressions, the second-stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Electricity Access in 1914" and the instrument is the "Hydropower Potential". Robust standard errors clustered by municipalities within 30km radius, following Conley (1999), are reported in parentheses. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

OLS estimates are positive and statistically significant, suggesting that electricity supply tended to be deployed in regions with higher economic growth prior to 1909. This also implies that the OLS estimators may be biased due to unobservable factors influencing regional growth. In contrast, columns (3)-(5) demonstrate that, across all specifications, the point estimates on the lagged values of manufacturing activities are much smaller than those in the main specification and statistically insignificant. These findings indicate that the IV estimates appropriately address this potential bias, as the instrument—hydropower potential—is orthogonal to potential confounders.

**Railway Access** It is possible that increased market size due to improved railway access stimulated manufacturing activities and the adoption of electric motors (Yamasaki, 2023). Since private railroad companies were, in some cases, responsible for electricity supply, railway access could bias the estimates upward. To address this concern, I include the change in the distance to the nearest railway station between 1909 and 1919 as an additional control, which captures increased railway access. The results in Table A4 show that the point estimates are nearly identical to those in the main specification and remain statistically different from zero, suggesting that the results are not driven by increased railway access.

**Infrastructure Investment** Another potential explanation is that infrastructure investment, such as the construction of dams, spurred manufacturing activities (Kline and Moretti, 2014; Leknes and Modalsli, 2020; Severnini, 2022). Although run-of-river hydroelectric power generation, which is the target of the hydropower potential used as the instrument, does not require large reservoirs, it could still be associated with substantial infrastructure investment. However, Table A5, which excludes municipalities hosting hydropower plants with a capacity over 2,000 kW in 1930, suggests that this is unlikely.<sup>20</sup> The point estimates become slightly smaller but remain statistically significant, indicating that the results are not primarily driven by infrastructure investment.

#### 4.3 Mechanism

I hypothesize that electric motors powered by purchased electricity, with their significantly lower fixed costs compared to steam engines, can reduce barriers to entry in the manufacturing sector with powered factories. Given that this argument aligns with historical anecdotes and descriptive evidence presented in Subsection 2.1, we would expect *new entrants* to be the primary contributors to the increase in manufacturing activities. I test this hypothesis by isolating the effect of new entrants from the baseline specification (Table 5).

Table 5 presents the results, where "Entrant" is defined as an establishment that began operating between 1909 and 1919.<sup>21</sup> The odd columns show the effects I introduced in Table 3 and the even columns present the effects of new entrants. Three key findings emerge from the analysis. First, comparisons between columns (1) and (2) suggest that electricity access not only stimulated the entry of new establishments but also encouraged exits (2.69-2.00), implying a within-sector reallocation. Second, while there are no significant impacts on the adoption of steam engines (columns (3)-(4)), the effect on entrants adopting electric motors is about 0.9 and statistically significant, accounting for 70% of the total effect (columns (5)-(6)). Finally, columns (7)-(8) show that the increase in manufacturing workers was mainly driven by new entrants, with 87% of the total effect attributable to the increase in workers employed by new entrants. Overall, these findings support the hypothesis that the reduction in fixed costs associated with electric motor use stimulated new entrant activity, particularly among those adopting electric motors, and contributed

<sup>&</sup>lt;sup>20</sup>Since most hydroelectric power stations had a capacity below 2,000 kW, this subsample analysis is compatible with the relevance condition of the IV strategy.

<sup>&</sup>lt;sup>21</sup>More specifically, I decompose the effects of the main results as follows:  $\Delta$ (# establishments) = (# entrants) – (# exits),  $\Delta$ (# establishments with technology) =  $\Delta$ (# incumbents with technology) + (# entrants with technology) – (# exits with technology),  $\Delta$ (# workers) =  $\Delta$ (# workers employed by incumbents) + (# workers employed by entrants) – (# workers employed by exits), where *entrants, incumbents*, and *exits* refer to establishments founded between 1909 and 1919, those continuing to operate in both 1909 and 1919, and those that ceased operations between 1909 and 1919, respectively. Note that the records only include establishments with at least ten workers.

		Nu	Demog	raphics					
	T	Total		w/ Steam Engine		w/ Electric Motor		Mnf. Workers	
	(1) $\Delta$ All	(2) Entrant	$\begin{array}{c} (3) \\ \Delta \text{ All} \end{array}$	(4) Entrant	$\begin{array}{c} (5) \\ \Delta \text{ All} \end{array}$	(6) Entrant	$\begin{array}{c} (7) \\ \Delta \text{ All} \end{array}$	(8) Entrant	
Electricity Access in 1914	2.00** (1.02)	2.69*** (0.858)	0.277 (0.215)	0.273 (0.170)	1.29*** (0.404)	0.909*** (0.265)	121.7*** (43.3)	105.3*** (37.5)	
Model	IV	IV	IV	IV	IV	IV	IV	IV	
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Streamflow	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Ruggedness	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Observations	10,005	10,005	10,005	10,005	10,005	10,005	10,005	10,005	
First stage F-stat	65.9	65.9	65.9	65.9	65.9	65.9	65.9	65.9	
Mean of dep.var	0.30	0.58	0.05	0.14	0.36	0.23	24.7	28.3	

Table 5: Mechanism: Effect of Electricity Access on Entrant Activities (1909-1919)

**Notes**: This table presents the effects of electricity access in 1914 on manufacturing activities, technology adoption, and demographics, estimated using IV methods. For IV regressions, the second-stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Electricity Access in 1914" and the instrument is the "Hydropower Potential". Robust standard errors clustered by municipalities within 30km radius, following Conley (1999), are reported in parentheses. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

to the increase in manufacturing employment. Table A6 presents the falsification test for these results. While there are positive effects on the number of entrants and the workers employed by them, these effects are considerably smaller than the estimates in Table 5.

### 5 Result: Long-run effect

### 5.1 **Population Dynamics**

A technological shock can have a long-run impact on regional growth (Alesina et al., 2013; Dittmar, 2011; Yamasaki, 2023; Kitamura, 2022). In particular, technological shocks in the manufacturing sector can accumulate over time, in contrast to those in the agricultural sector (Desmet and Rossi-Hansberg, 2009; Michaels et al., 2012). Therefore, regions that experience technological change earlier have the opportunity to accumulate more technical knowledge than others, leading to higher manufacturing wages and increased migration. This process also makes it difficult for lagging regions to expand manufacturing activities and catch up with leading regions due to the technological gap and the agglomeration forces within the manufacturing sector.

Motivated by this argument, I examine whether the regional advantages of achieving techno-

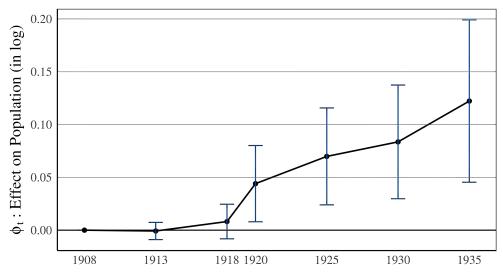


Figure 5: Effect on Population Growth in Early 20th Century

**Notes:** This figure illustrates the effects of earlier electricity access on population growth in the early 20th century.  $\phi_t$  represents the effect of one year earlier electricity access on population growth between 1908 and year t. Second-stage estimates of  $\phi_t$  are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Early Electricity Access" and the instrument is the "Hydropower Potential". The control variables include the municipality area size (in log), the distance to the metropolis (in log), population density in 1908 (in log), streamflow, ruggedness, and prefecture fixed effects. Robust standard errors are clustered by municipalities within 30km radius, following Conley (1999). Confidential intervals are calculated at the 95% level. Note that number of observations is 9,950 and the first stage F-statistic is 22.2.

logical change earlier influence the subsequent trajectory of regional development. The technical change from steam engines to electric motors profoundly transformed the power sources of manufacturing activities, making this technical shock a unique opportunity to study the long-run impact of technical change on regional development. To investigate the impact of the population dynamics, I estimate the following model:

$$\ln\left(\frac{\text{Population}_{it}}{\text{Population}_{i,1908}}\right) = \phi_t \text{Early Electricity Access}_i + \kappa_t \ln(\text{PopDens}_{i,1908}) + \xi_t \text{Geography}_i + \varsigma_{pt} + \epsilon_{ipt},$$
(4)

where *i*, *p*, and *t* represent the municipality, prefecture, and year, respectively, I estimate the regressions separately for each year-pair, such as analyzing changes from 1908 to 1913 using only data from those years. This approach avoids the interpretation challenges associated with regression models that pool data across multiple time periods (e.g., Roth et al., 2023). The dependent variable is the population growth between 1908 and *t*. The main explanatory variable, Early Electricity Access<sub>*i*</sub>, is defined as 1929 minus the year of first electricity access, assigning a

higher value to municipalities with earlier access.<sup>22</sup> Thus,  $\phi_t$  captures the effect of one year earlier electricity access on population growth between 1908 and year *t*. Given the potential endogeneity of the timing of electricity access, I use hydropower potential as an instrumental variable for early electricity access.

Figure 5 presents the second-stage estimates of  $\phi_t$ , representing the dynamic effect of early electricity access on population growth. While there is a sizable short-run impact on manufacturing activities, as discussed in Section 4, the short-run effect on population growth is small and statistically insignificant. However, the impact of early electricity access on population growth becomes gradually more pronounced over time, leading to over a 10% increase in population growth by 1935. This result, combined with the findings in Section 4, suggests that municipalities that experienced technical change earlier expanded manufacturing activities, leading to higher wages and agglomeration in the manufacturing sector. As a result, these municipalities attracted more economic activities, leading to a lasting advantage in subsequent regional development. This disparity in regional growth induced by the timing of technical change implies that agglomeration forces in manufacturing sector might have impeded industrialization in other regions.

#### 5.2 Today's Economic Activities

Next, I examine the persistent effects of early electricity access. Using firm-level data in all industries from Orbis (2012-2019), I estimate the impact of early electricity access on today's economic activities, using hydropower potential as an instrument.<sup>23</sup> Table 6 OLS and IV estimates. The results indicate that municipalities with earlier electricity access have achieved higher levels of economic development even today: they have more firms, larger employment, higher average sales, and greater productivity measured by sales per employee. These findings suggest that the regional advantages of early technical change have persisted over time, leading to a lasting impact on economic activities even 100 years later.

### 6 Conclusion

Understanding how technological change progresses and impacts regional development is crucial in policy debates on economic growth. To shed light on these issues, this paper examines the transition from steam engines to electric motors in early 20th-century Japan and its effect on regional economic activities. Drawing from the historical context, I hypothesize that electric motors powered by purchased electricity, with their much lower fixed costs compared to steam engines, played a pivotal role in lowering barriers to entry in the manufacturing sector, thereby

<sup>&</sup>lt;sup>22</sup>Note that I only digitized information on the year of first electricity access up to 1929 every five years (i.e., 1909, 1914, 1919, 1924, and 1929). Thus, Early Electricity Access, takes only five values: 20, 15, 10, 5, and 0.

<sup>&</sup>lt;sup>23</sup>Since the financial information of many firms is reported only for some years, I used data from 2012 to 2019. When multiple financial records were available during this period, I took average to address time specific factors.

	Num. o	Num. of Firms		f Emp.	Ave.	Sales	Sales/Emp.	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Early Electricity Access	0.057*** (0.004)	$0.158^{*}$ (0.084)	0.066 <sup>***</sup> (0.005)	0.185* (0.103)	0.024 <sup>***</sup> (0.003)	0.095* (0.054)	0.010 <sup>***</sup> (0.002)	0.067* (0.039)
Model	OLS	IV	OLS	IV	OLS	IV	OLS	IV
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Streamflow	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Ruggedness	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	9,852	9,852	9,474	9,474	9,852	9,852	9,474	9,474
First stage F-stat		26.4		29.6		26.4		29.6
Mean of dep.var	3.4	3.4	5.0	5.0	7.8	7.8	6.3	6.3

Table 6: Effects of Early Electricity Access on Today's Economic Activities (in log)

**Notes**: This table presents the effects of early electricity access on economics activities in 21st-century, estimated using OLS and IV methods. For IV regressions, the second-stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Early Electricity Access" and the instrument is the "Hydropower Potential". "Early Electricity Access" is defined as 1935 minus the year of the first electricity access. Robust standard errors clustered by municipalities within 30km radious, following Conley (1999), are reported in parentheses. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

stimulating manufacturing activities.

To investigate this hypothesis, I exploit the historical expansion of electricity grids and newly digitized official records. To address the endogeneity of electricity access, I use hydropower potential as an instrumental variable, controlling for other regional characteristics. The results indicate that electricity access significantly increased manufacturing activities by stimulating the entry of new establishments. This finding underscores the importance of new entrants in driving technological change and manufacturing growth during the Second Industrial Revolution Moreover, I find that municipalities with earlier electricity access experienced greater population growth, resulting in a lasting advantage in subsequent regional development. Exploring the underlying mechanisms that drove this lasting impact presents an interesting avenue for future research.

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# Appendix A Historical Background: Additional Details

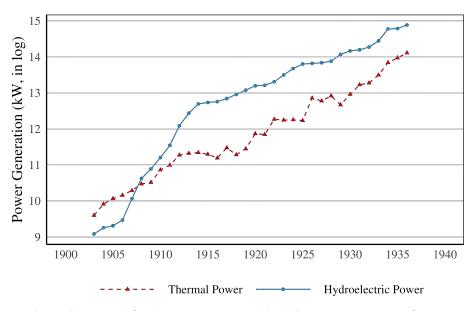


Figure A1: Source of Power Generation

**Notes:** This figure shows the source of power generation in early 20th-century Japan as a five-year moving average. **Source:** Ministry of Communications (1938)

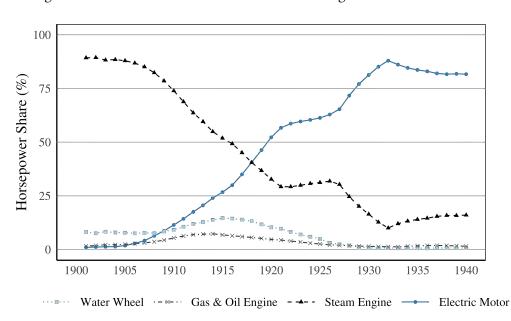


Figure A2: Power Source Transition from Steam Engine to Electric Motor

**Notes:** This figure displays the trends in the share of horsepower generated by each power source in Japan from 1900 to 1940 as a five-year moving average. The data comes from Minami (1979), which compiled and calculated the amount of horsepower from various statistical records published by the central government. **Source:** Minami (1979)

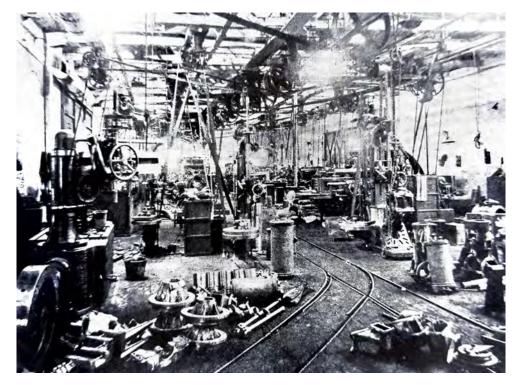


Figure A3: Inronworks Factory Powered by Steam Engine (Group Drive System)

**Notes:** The picture shows an ironworks factory powered by steam engines in 1907, where power generated by steam engines is transmitted via shafts and belts affixed to the roof (*Group Drive System*). This production system required sizable and sturdy workshops.

Source: Ikegai Ironworks (1941)

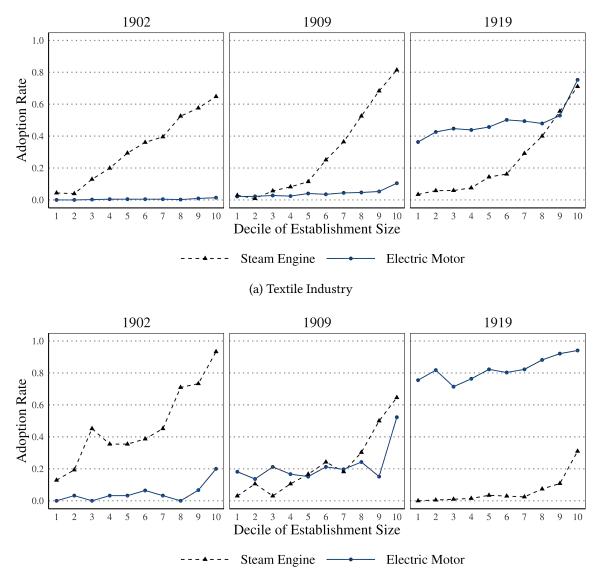


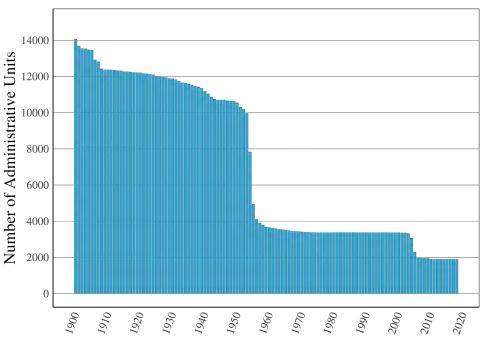
Figure A4: Technology Adoption by Establishment Size (by Industry)

(b) Machinery Industry

**Notes:** These figures display the adoption rate of steam engines and electric motors by establishment size in 1902 (left), 1909 (center), and 1919 (right), where we define the number of workers as a measure of establishment size. Each point represents the average adoption rate among establishments in each decile bin. Note that the minimum number of workers is ten.

Source: Ministry of Agriculture and Commerce (1904, 1911, 1921)

# Appendix B Data: Additional Details



#### Figure A5: Administrative Changes in Japan

**Notes:** This figure shows the trend in the number of administrative units in Japan from 1900 to 2020. In all analyses throughout this paper, I use the harmonized municipality unit, which represents the most aggregated unit from 1900 to 1940. For a validity check, I also harmonized the municipality transitions from 1940 to 2020, although this was not used in the main analysis. **Source:** Higashide (2024)

			34. 供	給 區 域
也方	事業者	供給區域	從 業 者	備考
三爪	馬野川水電 株式會社	(三流縣) 阿山郡 阿波村, 布引村, 山田村	社 長 馬 岡 次 郎 主任技術者 田 原 宮 次 従業者 31	
	十社電氣株式會社	(三流縣) 員 辨 郡 十 赴 村,中 里 村,自 海 村,西藤原村	社 長川湘港之助 主任技術者 赤塚 忠 從業者 24	
酸愛 知	矢作水力株式會社	(較阜縣) 激 那 # 大 井 町, 長 島 町, 岩 村 町, 本 郷 村 上 愛如縣) 北 設築那 稍 積 枯, 武 節 村 額 田 郡 龍 ケ 谷村 (愛 加點) 名古屋市 回 転 声		9年 3月岩村電氣軌道合併
		岡崎市 簡 田郡 同 階 村,龍ヶ谷村 翌 海 郡 芝 谷 町, 壹 谷 町, 清 郡 町, 雖 米 村 榑 五 郡 西 尾 町	為日 開 大郎 田 中 福 之 助 相 談 役 福 澤 桃 介 主任技術者 小 山 柳 一 税業者 294	

Figure A6: Original Sample Page of the Handbook of Electric Utility Industry

**Notes:** This picture shows a sample page from Ministry of Communications (1930), providing information on the electricity supply areas for each utility company. I digitized this table across several editions to construct a panel dataset of electricity access status for the years 1909, 1914, 1919, 1924, and 1929. **Source:** Ministry of Communications (1930)

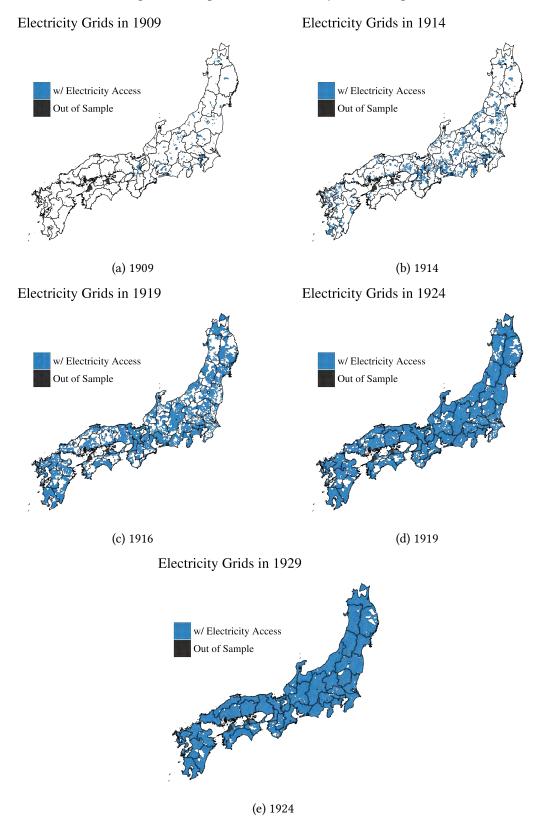
# Appendix C Descriptive Statistics

### Appendix C.1 Summary Statistics

Variable	Observation	Mean	SD	Min	Max
Geography					
Area Size $(km^2)$	10429	27.199	40	0.105	699
Distance to Coast ( <i>km</i> )	10429	25.111	24.8	0.01	113
Distance to the Metropolis $(km)$	10429	192.256	156.7	0	655
Hydropower Potential	10429	0.003	1	-0.471	11
Ruggedness (degree)	10429	10.082	7.9	0.007	35
Streamflow	10429	0.004	1	-0.844	8
Pre-Access Economic Developmen	t				
Population in 1908	10429	4631.128	15718.5	42	625193
Railway Access in 1909 (km)	10429	13.337	15.2	0.014	106
Electricity Access					
Electricity Access in 1909	10429	0.041	0.2	0	1
Electricity Access in 1914	10429	0.26	0.4	0	1
Electricity Access in 1919	10429	0.714	0.5	0	1
Electricity Access in 1924	10429	0.935	0.2	0	1
Electricity Access in 1929	10429	0.987	0.1	0	1
Manufacturing Activities in 190	9				
Number of Establishments	10429	1.327	9.5	0	432
- w/ Water Wheel	10429	0.125	0.8	0	35
- w/ Steam Engine	10429	0.321	2.1	0	91
- w/ Electric Motor	10429	0.085	1.4	0	65
Number of Workers	10429	60.623	557.5	0	30121
Today's Economic Activity					
Number of Firms	10429	113.257	618.8	0	31084
Employment (× $10^3$ )	10429	0.982	7.9	0	301
Sales ( $\times 10^6$ yen)	10429	1.533	28.6	0	2151

### Table A1: Descriptive Statistics

**Notes**: This table shows the summary statistics of the municipality characteristics. The Metropolis refers to Tokyo, Yokohama, Nagoya, Kyoto, Osaka, and Kobe, stipulated as the six largest cities by the law in 1922. "Streamflow" indicates the estimated mean annual streamflow weighted by the area size and "Ruggedness" is the average slope of the municipality. Note that "Hydropower Potential" and "Streamflow" are standardized so that the mean is zero and the standard deviation is one. Railway Access means the minimum distance to the nearest railway station.



### Figure A7: Expansion of Electricity Grids in Japan

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# Appendix D Additional Results

### Appendix D.1 IV: Hydropower potential

		Nur	nber of Es	tablishme	ents	
		Total		w/ Water Wheel		
	(1)	(2)	(3)	(4)	(5)	(6)
Hydropower Potential $\times$ 1902	-0.024	-0.020	-0.004	-0.017	-0.016	-0.010
	(0.022)	(0.023)	(0.023)	(0.020)	(0.020)	(0.021)
Hydropower Potential × 1916	0.015	0.023	0.018	-0.001	-0.002	-0.003
	(0.016)	(0.016)	(0.017)	(0.010)	(0.010)	(0.011)
Hydropower Potential $\times$ 1919	0.091**	0.090**	$0.080^{**}$	0.000	0.001	0.000
	(0.036)	(0.037)	(0.038)	(0.021)	(0.021)	(0.021)
Municipality FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Year FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Geography × Year FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Pop. density $1908 \times \text{Year FE}$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Streamflow $\times$ Year FE		$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$
Ruggedness × Year FE			$\checkmark$			$\checkmark$
Observations	40,020	40,020	40,020	40,020	40,020	40,020
Adjusted R <sup>2</sup>	0.68	0.68	0.68	0.58	0.58	0.58
Mean of dep.var	0.72	0.72	0.72	0.09	0.09	0.09

Table A2: Hydropower Potential and Manufacturing Activities

**Notes**: This table presents the effects of hydropower potential on manufacturing activities and water wheel adoption. Observations are municipalities where the electricity supply began after 1909. Robust standard errors clustered at the municipality level are reported in parentheses. The dependent variable "w/ Water Wheel" and "w/ Steam Engine" represent the number of establishments using water wheels and the number of establishments using steam engines, respectively. The independent variable, "Hydropower Potential", is a standardized measure of municipality-level potential for hydropower generation, with standard deviation of one, thus the estimates reflect differences in economic activities with one standard deviation higher hydropower potential. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

	Electric	city Access	in 1914	Early Electricity Access			
	(1)	(2)	(3)	(4)	(5)	(6)	
Hydropower Potential	0.041 <sup>***</sup> (0.007)	0.042 <sup>***</sup> (0.007)	0.041 <sup>***</sup> (0.007)	0.216 <sup>***</sup> (0.074)	0.219 <sup>***</sup> (0.076)	0.250*** (0.076)	
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Streamflow		$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$	
Ruggedness			$\checkmark$			$\checkmark$	
Observations	10,005	10,005	10,005	10,005	10,005	10,005	
Adjusted R <sup>2</sup>	0.23	0.23	0.23	0.31	0.31	0.31	
F-test (1st stage)	72.7	70.1	65.9	18.0	17.9	22.7	
Mean of dep.var	0.23	0.23	0.23	15.7	15.7	15.7	

Table A3: First Stage: Relationship between Hydropower Potential and Electricity Access

**Notes**: First stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Robust standard errors clustered by municipalities within 30km radius, following Conley (1999), are reported in parentheses. The instrumental variable, "Hydropower Potential", is a standardized measure of municipality-level potential for hydropower generation, with standard deviation of one, thus the estimates reflect differences in electricity access with one standard deviation higher hydropower potential. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

### Appendix D.2 Short-run effect: Robustness

	$\Delta$ Num	ber of Establis	shments (	1909-1919)	Demog	raphics
	Total (1)	w/ Electric Motor (2)	Total (3)	w/ Electric Motor (4)	Δ Mnf. Workers (1909-1919) (5)	Δ Pop. (1908-1918) (6)
Electricity Access in 1914	0.298***	0.551***	$2.02^{*}$	1.29***	122.5***	156.0
	(0.088)	(0.062)	(1.04)	(0.409)	(44.7)	(376.8)
$\Delta$ Railway Access	-0.038	-0.034	0.036	-0.002	2.19	-28.4
	(0.044)	(0.026)	(0.070)	(0.032)	(3.13)	(28.1)
Model	OLS	OLS	IV	IV	IV	IV
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Streamflow	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Ruggedness	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	10,005	10,005	10,005	10,005	10,005	9,991
First stage F-stat			64.6	64.6	64.6	65.5
Mean of dep.var	0.30	0.36	0.30	0.36	24.7	228.1

#### Table A4: Robustness: Effect of Electricity Access on Industrialization

**Notes**: This table presents the effects of electricity access in 1914 on manufacturing activities, electric motor adoption, and demographics, estimated using OLS and IV methods. For IV regressions, the second-stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Electricity Access in 1914" and the instrument is the "Hydropower Potential". Robust standard errors clustered by municipalities within 30km radius, following Conley (1999), are reported in parentheses. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). The variable " $\Delta$  Railway Access" represents the change in the distance to the nearest railway station between 1909 and 1919. \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

	$\Delta$ Num	ber of Establis	Demog	raphics		
	Total (1)	w/ Electric Motor (2)	Total (3)	w/ Electric Motor (4)	Δ Mnf. Workers (1909-1919) (5)	Δ Pop. (1908-1918) (6)
Electricity Access in 1914	0.328*** (0.090)	0.560*** (0.064)	1.34* (0.771)	1.32*** (0.395)	90.0** (40.8)	121.1 (357.6)
Model	OLS	OLS	IV	IV	IV	IV
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Streamflow	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Ruggedness	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	9,864	9,864	9,864	9,864	9,864	9,850
First stage F-stat			67.4	67.4	67.4	68.3
Mean of dep.var	0.30	0.37	0.30	0.37	24.5	224.3

Table A5: Robustness: Drop Municipalities with Large Hydropower Stations

**Notes**: This table presents the effects of electricity access in 1914 on manufacturing activities, electric motor adoption, and demographics, estimated using OLS and IV methods. For IV regressions, the second-stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Electricity Access in 1914" and the instrument is the "Hydropower Potential". Robust standard errors clustered by municipalities within 30km radius, following Conley (1999), are reported in parentheses. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.

	Number of Establishments						Demographics	
	Total		w/ Steam Engine		w/ Electric Motor		Mnf. Workers	
	$\begin{array}{c} (1) \\ \Delta \text{ All} \end{array}$	(2) Entrant	$\begin{array}{c} (3) \\ \Delta \text{ All} \end{array}$	(4) Entrant	$\begin{array}{c} (5) \\ \Delta \text{ All} \end{array}$	(6) Entrant	$\begin{array}{c} (7) \\ \Delta \text{ All} \end{array}$	(8) Entrant
Electricity Access in 1914	0.176 (0.693)	0.762* (0.406)	0.383** (0.170)	0.181 (0.127)	0.012 (0.016)	0.011 (0.009)	24.4 (28.0)	32.8** (14.5)
Model	IV	IV	IV	IV	IV	IV	IV	IV
Prefecture FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Geography	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Pop. density 1908	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Streamflow	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Ruggedness	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	10,005	10,005	10,005	10,005	10,005	10,005	10,005	10,005
First stage F-stat	65.9	65.9	65.9	65.9	65.9	65.9	65.9	65.9
Mean of dep.var	0.33	0.33	0.07	0.10	0.004	0.002	10.5	11.7

Table A6: Falsification: Effect of Electricity Access on Entrant Activities (1902-1909)

**Notes**: This table presents the effects of electricity access in 1914 on manufacturing activities, technology adoption, and demographics, estimated using IV methods. For IV regressions, the second-stage estimates are reported. Observations are municipalities where the electricity supply began after 1909. Estimates are from instrumental variables specifications in which the endogenous variable is "Electricity Access in 1914" and the instrument is the "Hydropower Potential". Robust standard errors clustered by municipalities within 30km radius, following Conley (1999), are reported in parentheses. The vector of control variables, "Geography", includes the municipality area size (in log), the distance to the coast (in log), and the distance to the metropolis (in log). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels.