

# Environmental impact and cost study of vehicles

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**Abstract.** In the traditional automobile industry, which was dominant from the mid-20th century to the early 21st century, the nitrogen oxides produced by auto mobile exhaust would pollute the air. After entering the 21st century, with lithium batteries as the representative, the energy density of energy storage units has rapidly increased, solving the endurance problem that has plagued the electric vehicle industry for nearly a century. The development path of electric vehicles has become wider and gradually become mainstream products in the market. This paper explores the environmental impact of transitioning from partial to complete tram usage in an urban area with a population of at least 500,000. Initially, this paper calculates the Ecological Evaluation Index to compare the environmental effects of the two types of vehicles. Subsequently, introducing four variables to set the entire model in motion, aiming to predict the environmental conditions of the urban area when entirely reliant on tram services. Furthermore, this paper considers the realistic financial issues that need to be faced and build a model for the financial impact that the transition to pure electric buses will soon bring. The excessive costs and potential external funds caused by the transition, which will affect the final ten-year transformation plan for the city. Finally, this transit company has successfully achieved an operational income of up to 13.3 billion over the past decade even in the absence of government subsidies. This underscores the robust foundation of its financial operations and economic sustainability, providing reliable financial support for future electric bus procurement and maintenance.

**Keywords:** Environmental impact, cost, vehicles, prospect, application

## 1. Introduction

From the first industrial revolution to the rapid development of high technology today, the automobile is undoubtedly one of humanity's greatest inventions, pivotal to the process of industrialization. While its emergence significantly propelled industrialization, it concurrently introduced environmental and energy challenges, such as climate change, to human society. As a major emitter of greenhouse gases, China faces increasing political and economic pressure due to climate change in the processes of industrialization and urbanization. Therefore, we should actively adopt energy and environmental policies for intervention and adjustment. Entering the 21st century, with lithium batteries as the representative, the energy density of energy storage units has rapidly increased, resolving the endurance problem that has plagued the electric vehicle industry for nearly a century. The development path of electric vehicles has broadened, gradually making them mainstream products in the market [1, 2].

The goal of this paper is to comprehensively consider various factors, including the ecological impact of pure electric bus fleets on regions, the potential external costs of replacing vehicle models, and complete the long-term planning for the replacement of large metropolitan buses. By utilizing this model,

we aim to predict and formulate the most suitable pure electric bus development plan for urban development with a population of more than 500,000.

The first model is to help the city understand the ecological impact that the transition from a mixed mode of fuel cars and electric cars to a pure electric bus fleet may bring. The second model is to explore the financial impact that the transition will soon bring to the urban. This paper consider the additional costs and potential external funds caused by the transition, which will influence the final ten-year transformation plan for the city [3, 4]. Using a comparative approach between fuel buses and electric buses, we will comprehensively consider additional factors due to the conversion to rank expenditures from high to low. The third step will integrate the two models mentioned above to provide a ten-year planning roadmap for the selected city, explaining its rationality and practicability. This model will help alleviate environmental pollution and energy crises caused by traditional vehicle models.

## 2. Methodology

### 2.1. Energy required and consumption

Considering the energy consumption of each vehicle over a distance of 100 kilometers as comprising three components. The first component is the energy required for manufacturing fuel [5]. The second component is the fuel consumption for each type of vehicle over the 100-kilometer distance. For conventional fuel-powered vehicles as shown in Eq. (1). For electric vehicles as shown in Eq. (2). According to tailpipe emissions, the energy equivalent of CO<sub>2</sub> emissions from diesel vehicles were calculated.

$$P_D \times T_{D100} = E_{TD} \quad (1)$$

$$P_{CO_2} \times T_{EC100} = T_{CO_2} \quad (2)$$

where P is the price of purchasing the buses and its value is 1000000 RMB; P<sub>D</sub> is the energy for manufacture of diesel per gallon; P<sub>CO<sub>2</sub></sub> is the CO<sub>2</sub> emitted for 1kwh of electricity; T is the tax of buying the buses and its value is 100000 RMB.

### 2.2. Population growth to the number of buses

Due to the simultaneous growth of the population and the rise in the number of buses in response to this population growth, this paper will derive two formulas through fitting using population and bus data from Beijing.

The observed population growth in the data aligns with logistic regression, as a region's population typically exhibits an upper limit constrained by available resources. Similarly, the growth of buses follows a comparable logic: even with an increasing population and greater demand for buses, the rate of bus additions tends to decelerate.

The relationship between time and population is shown in Eq. (3). The relationship between population and vehicles is shown in Eq. (4).

$$N_p = \frac{2469.61809}{1 + 1.3225 \times e^{-0.1069t}} \quad (3)$$

where N<sub>p</sub> is the number of people in the city.

$$N_b = \frac{23169.42}{1 + 1942.7e^{-0.00544N_p}} \quad (4)$$

where N<sub>b</sub> is the total number of buses in the city.

### 2.3. Vehicle conversion quantity model

Due to the decreasing trend of diesel buses over time and the necessity to compensate for this reduction, as shown in Eq. (5).

$$|N_D| = N_{C1} \quad (5)$$

where N<sub>d</sub> is the number of buses using diesels; N<sub>c</sub> is the number of buses using batteries(cell).

Additionally, to ensure an overall upward trend and considering that all new vehicles added annually due to population growth in recent years in Beijing data are electric buses, the Eq. (6)-(9) was proposed.

$$N_b = N_{C2} \quad (6)$$

$$t = n \quad t = n + 1 \quad (7)$$

$$N_C = N_b + |N_D| \quad (8)$$

$$|N_D| = 370 \times e^{-0.013x} \quad (9)$$

Through Eq. (9), the year at which the sum of  $|N_D|$  is equal to  $N_{Dinit}$  by integrating can be obtained, which is also marked the end of this model, as shown in Eq. (10).

$$N_{Dinit} = \int_{0.1}^n e^{-0.013t} dt \quad (10)$$

#### 2.4. Termination condition

According to the given prompt, the model will stop predicting when the number of diesel buses reaches zero. This serves as our termination condition. In the final state is shown in Eq. (11).

$$E_{total} = N_D \times E_D + N_C \times E_C \quad (11)$$

where  $N_D$  value is the total number of buses in the city;  $E_C$  is the ecological evaluation index of each E-buses (kJ/car) and the value is  $9.8921987588 \times 10^9$ .

#### 2.5. Model for bus company's income

This study presents a prospectus for the future development of electric buses in Beijing over the next decade [6]. Despite the relatively low fare and the resulting deficit status of public bus transportation in Beijing, we contend that advertising fees incurred by the transit companies should be considered within the scope of their overall revenue. This paper undertakes a fitting and predictive analysis of the anticipated changes in electric bus demand, concurrently speculating on the future revenue trends of the public transit companies.

In this analysis, meticulously account for the contribution of advertising fees, aiming to reveal the economic conditions of future public transit systems in a more comprehensive and scholarly manner. The research endeavors to furnish a reliable theoretical foundation for future urban transportation planning, considering the diversification of income sources in public transit. The text handles the reduction of diesel buses and the introduction of electric buses on an incremental basis due to the discrete nature of the data. Subsequently, linear regression is employed to facilitate the presentation of a comprehensive model [7].

#### 2.6. Model for future growth of the number of buses

This study suggests that the annual growth of electric buses in public transit aligns with an exponential pattern, acknowledging diverse plans and objectives across governments, organizations, and companies. This assertion is grounded that public transit companies' planning akin to the national GDP's annual growth plan of  $X\%$ , with the electric bus quantity developing at a fixed rate of  $M\%$  each year. It's worth noting that the increase in electric buses tends to stabilize once it meets population demands. This highlights the relevance of exponential functions in describing such trends, offering a clear explanation of the regularity in electric bus growth. As of the writing of this paper, the public transit group has not yet released the electric bus data for 2023, as the year has not concluded. Considering the calculation starting from 2022, the tenth year falls in 2033 (Eq. (12)).

$$r = \frac{N_{b_{n+1}}}{N_{b_1}} \quad (12)$$

where  $N_1$  is 23456 (number of electric bus in 2022),  $N_{11}$  is 38774.

### 3. Results and discussion

#### 3.1. Ecological evaluation

**3.1.1. Ecological evaluation index.** The term “environmental impact” poses a challenging state to quantify. Here, all energy consumption is considered as various forms of pollution. Given that energy usage involves conversion processes, inherent losses and inefficiencies exist in each step. Consequently, within our assumption, emissions can be interchangeably viewed as a form of energy.

In analysis, adopt a comprehensive approach using the life cycle analysis method to thoroughly incorporate energy consumption and noise generated from the vehicle. This spans from its deployment to its decommissioning [8]. Certain values employed in our assessment, such as the energy required for gasoline production, remain essentially constant and are not significantly influenced by different urban environments. These values are considered fixed parameters in analysis.

**3.1.2. Ecological evaluation model.** Through the formulas, the number of years were obtained, denoted as “n”, for the diesel buses to reach zero when transitioning from a certain proportion of diesel buses (Eq. (13)).

$$n = -\frac{1}{0.013} \times \ln \left( \frac{0.013}{370} \times N_{binit} \times N_{Dratio} + e^{-0.013} \right) \quad (13)$$

This represents the difference between the sum of the Ecological Evaluation Index in the final state and the sum of the Ecological Evaluation Index in the initial state (Eq. (14)).

$$\Delta E = (E_C \times \frac{23169.3}{13.435}) - (E_D \times N_{binit} \times N_{Dratio} + E_D \times N_{binit} \times (1 - N_{Dratio})) \quad (14)$$

$$1 + 1942.7e^{\frac{-13.435}{1+1.323e^{-0.107n}}}$$

If  $\Delta E < 0$ , the ecological consequence of changing to a full electric bus fleet is positive; otherwise, we believe it is negative.  $E_D$  is the ecological evaluation index of each diesel buses (kJ/car) and its' value is  $6.1290 \times 10^{10}$ .

#### 3.2. Full life cycle cost for public buses

**3.2.1. Maintenance cost.** The comprehensive maintenance cost for a single electric bus should encompass both the direct expenses associated with repairs and the subsidy allocated for recycling. Maintenance costs for a bus exhibit dynamic variation over its life cycle. As time progresses, these expenses gradually diminish due to escalating labor costs [9].

Consequently, the overall maintenance cost is intricately linked to factors such as labor costs, inherent repair expenses, and the subsidy granted for recycling. Hence, the maintenance cost can be expressed as Eq. (15).

$$C_0 = N + M - S \quad (15)$$

Regarding labor costs (N), these costs and average wages will consistently escalate due to the influences of inflation and currency appreciation or depreciation. Technological advancements contribute to a gradual reduction in actual repair expenses as high-tech solutions become more prevalent. Simultaneously, the burgeoning population, coupled with increasing price levels, leads to an augmented demand for wages naturally expect their remuneration to rise over time.

Drawing insights from corporate reports, such as those from Beiqi Foton, it is evident that labor costs tend to increase at an annual rate of 5%. Consequently, the function for labor cost (N) was calculated as  $7.6 \times 1.05^t$  RMB.

In depicting the relationship between exclusive maintenance costs (y) and time (x), the serves as a visual representation of how these costs evolve over the specified timeframe. It provides a clear visualization of the trends and patterns associated with exclusive maintenance costs, allowing for a more nuanced understanding of the dynamic nature of these expenses [10].

In the pursuit of the most realistic fit to real-world scenarios, select an exponential function with the base 'e' for curve-fitting analysis. This choice is making our model more reflective of practical circumstances. The resulting mathematical expression, derived from the curve-fitting exercise, adds another layer of sophistication to analysis. Table 1 is the average cost of Full life cycle electricity retirement allowance. It not only enhances the precision of predictions but also aligns more closely with the complex and evolving nature of exclusive maintenance costs within the context of a prolonged 10-year forecast was  $5.88 \times 1.05^{-0.16t}$  RMB.

**Table 1.** Average cost of Full life cycle electricity retirement allowance.

Year	1	2	3	4	5	6	7	8
10,000 RMB	108	118	128	137	147	156	166	175

Upon the decommissioning of a fully electric bus, governmental regulations stipulate that each retired vehicle is entitled to a subsidy equivalent to 4% of the initial purchase cost. The bus scrapping subsidy is  $4.4 \times 10^4$  RMB, the total cost of the whole process from purchasing to scrapping is  $(7.66 \times 1.05^t + 5.88 \times 1.05^{-0.16t} - 4.4 \times 10^4)$  RMB.

**3.2.2. Using buses cost.** Within the scope of this research, focus centers on the operational costs of fully electric buses, with a particular emphasis on the electricity consumption expenses incurred by an individual bus over the course of a year [11]. This cost primarily involves expenditures related to electrical power. As such, we define the methodology for calculating the annual total electricity cost as the product of the annual mileage and the energy consumption per kilometer, further multiplied by the unit cost of electricity.

The average distance a bus travels in a year was 73440 km. The lack of direct correlation between the annual mileage of a fully electric bus and its overall life cycle. In other words, the yearly mileage is presumed to remain constant throughout the vehicle's operational life. To establish a consistent and reliable estimate for the annual mileage, we extract specific driving data for individual buses from charts provided by BeiQi Foton (Table 2).

**Table 2.** Basic Information Investigated from BeiQi Foton

One way (km)	Pure electric range(km)	Daily round trip	Daily mileage (km)	Annual operating days(Days)	Annual operating mileage(km)
18	200	6	216	340	73440

Energy consumption per kilometer reflects the bus's efficiency in using electricity over a distance, which was calculated as 115kWh/100km. the average price of electricity (Pi) represents the financial aspect of procuring the required energy, which was calculated as 0.75 RMB/kWh. The cost of using the buses and its value is 59120. The prices of purchasing the buses and its value is 1000000 RMB. The fuel cost of Diesel is 8.04 RMB/L. The fuel cost of electricity was 0.7 RMB/kWh

After finding the points corresponding to each part, overlay them to obtain the cost of a single pure electric bus in different years of its life cycle, which is  $(7.66 \times 1.05^t + 5.88 \times 1.05^{-0.16t} - 4.4 + 111.5) \times 10^4$  RMB. The total cost of all the buses throughout a year is  $\frac{(7.66 \times 1.05^t + 5.88 \times 1.05^{-0.16t} - 4.4 + 111.5) \times 23169}{1 + 1942.7e^{-0.00544Np}}$

**3.2.3. Charging station cost.** Public charging stations for fully electric buses constitute a pivotal infrastructure supporting the electrification of urban public transportation. Generally, charging station costs encompass equipment procurement, installation fees, land leasing costs (if applicable), power connection charges, as well as operational and maintenance expenses, denoted collectively as charging. The power capacity of charging stations is contingent on design specifications and market demands.

For the purposes of this study, focus on a specific type of charging station, namely the dual-gun 240 kW station, with a cost of 70,000 RMB per station. This cost encompasses equipment procurement, installation, and power connection charges. Furthermore, the power and interface design of charging

stations dictate the types of electric vehicles they can service. The dual-gun 240 kW charging station studied here has the capacity to simultaneously service four buses, with the construction quantity contingent upon the number of buses in the fleet.

While government support for electric transportation infrastructure development is prevalent in many regions, including subsidies, tax incentives, reduced land rents, or direct government grants for charging infrastructure, it's crucial to note that, as described in the preceding section denoted as R, the Chinese government will cease subsidies for electric bus-related constructions by 2023. Consequently, this aspect is excluded from the considerations in this paper. In line with focus on charging station construction considerations, land costs are omitted from this model. The total cost of building public charging piles

$$\text{is } \frac{4.055 \times 10^8}{1 + 1942.7e^{-\frac{13.435}{1 + 1.323e^{-0.107t}}}}$$

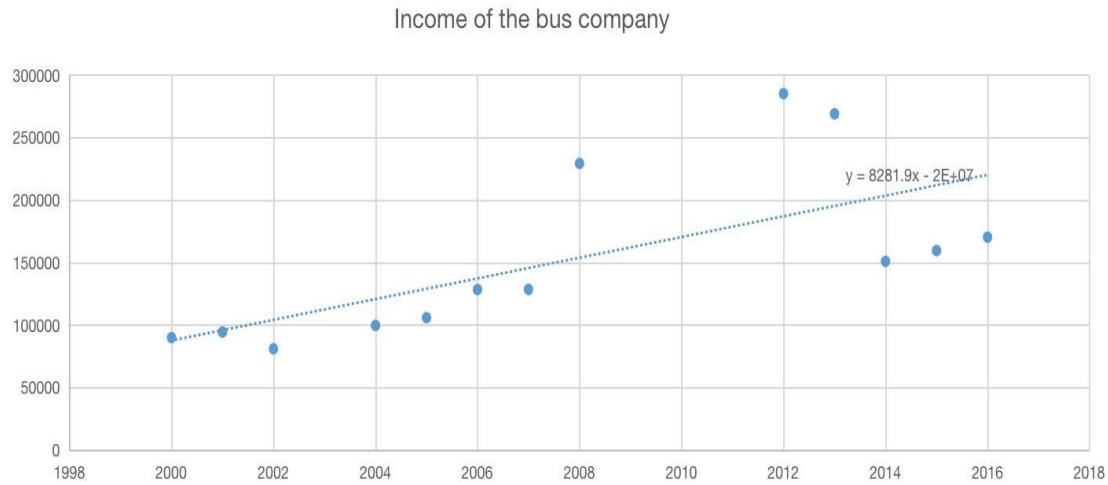
### 3.3. Prospect and expectation for the next 10 years

**3.3.1. Company's income.** Based on official data from the Beijing Public Transport Group, as of the year 2022, the inventory of diesel buses stands at 9318 vehicles. To comprehensively consider the scenarios involving the replacement of diesel buses and the addition of new electric buses in the future, this study combines this figure with the anticipated number of new electric vehicles (6000 units). Consequently, the total number of buses in 2022 is calculated to be 15,318.

Concurrently, employing a linear regression approach based on the annual industrial output values from 2000 to 2016 in the data provided by the Beijing Public Transport Group (Table 3 and Figure 1). This research estimates the total industrial output of the public transit company for the years 2023 to 2032. This analytical process aims to offer more precise predictions for the economic activities of the public transit company in the coming decade through trend inference. Through this rigorous and logical methodology, we can achieve a more comprehensive understanding and outlook for the future development and economic performance of the public transportation system in Beijing. We can conclude that:  $y = 8987.4845x - 1.789 \times 10^7$  (The variable y represents the industrial output of the public transit company in the year x).

**Table 3.** The number of bus from 2000 to 2016

Year	Income	Income
2000	89986	16717
2001	94473	19221
2002	81044	21049
2003	52099	22696
2004	99763	24153
2005	105893	24091
2006	128455	25409
2007	128543	25368
2008	229406	28071
2009	85616	27963
2010	86833	27569
2011	118544	28343
2012	285170	21218
2013	269054	22555
2014	150963	22630
2015	159612	22250
2016	170343	29515



**Figure 1.** Using a linear function to fit the data. (Photo/Picture credit: Original)

**3.3.2. Future growth of the number buses.** In the scenario where the growth rate ( $r$ ) is determined to be 1.046753, indicating that the electric bus quantity in the second year grows by approximately 1.05 times relative to the first year, this study can construct a progressive data table for the annual demand for electric buses, as shown in Table 4.  $N_1$  is 23456 (number of electric bus in 2022),  $N_{11}$  is 38774.

**Table 4.** Blueprint of buying electric bus and charging piles and relating costs

	Income (RMB)	Expense (RMB)	Number of bus	Growth number	Income minus expense (RMB)	Cost per bus (RMB)	Total maintain cost (RMB)
2022	282,695.48		23456				
2023	291,682.96	234,429.62	24553	1097	57,253.34	5.00	122,846.67
2024	300,670.45	226,160.13	25700	1147	74,510.32	4.26	109,360.34
2025	309,657.94	219,615.09	26902	1201	90,042.84	3.62	97,354.56
2026	318,645.42	214,643.38	28159	1257	104,002.04	3.08	86,666.80
2027	327,632.91	211,112.23	29476	1316	116,520.68	2.62	77,152.36
2028	336,620.39	208,905.33	30854	1378	127,715.07	2.23	68,682.43
2029	345,607.88	207,921.08	32297	1442	137,686.79	1.89	61,142.35
2030	354,595.36	208,071.11	33807	1509	146,524.25	1.61	54,430.03
2031	363,582.85	209,278.86	35387	1580	154,303.98	1.37	48,454.60
2032	372,570.33	211,478.45	37042	1654	161,091.89	1.16	43,135.17
2033	381,557.82	214,613.54	38773	1731	166,944.28	0.99	38,399.71

With the annual data on the number of buses in hand, can calculate the financial outlay required for the procurement of new energy equipment. Based on data provided by Beiqi Foton Motor Co., Ltd. (the primary supplier for the Beijing public transit system), the approximate purchase price for each electric bus is 1 million RMB. Given the relatively longer charging time for electric buses compared to the refueling time for diesel buses, there arises a demand for more charging stations. According to statistics, the ratio of electric buses to charging stations is approximately 1: 4. The acquisition cost for each charging station is 70,000 RMB.

**3.3.3. Application of the maintenance cost.** Exponential functions suit this problem, reflecting national economic growth's impact on rising labor costs and decreasing machine costs. With battery electric buses being predominantly recent, and not yet reaching full coverage, we assume the government won't

incur additional expenses [12, 13]. Some buses with external wiring have disposal costs similar to diesel buses, forming a natural scrapping process without special considerations. This argument underscores the relevance of exponential functions in describing economic factors, offering a nuanced analysis of electric bus disposal costs (Eq. (16)). This paper delineates the annual maintenance costs (W), as illustrated as Table 5.

$$y=5.88t-0.16 \quad (16)$$

where y represents the annual maintenance cost for every two electric buses, and t denotes the time interval from the year 2023 (with t=1 in 2023).

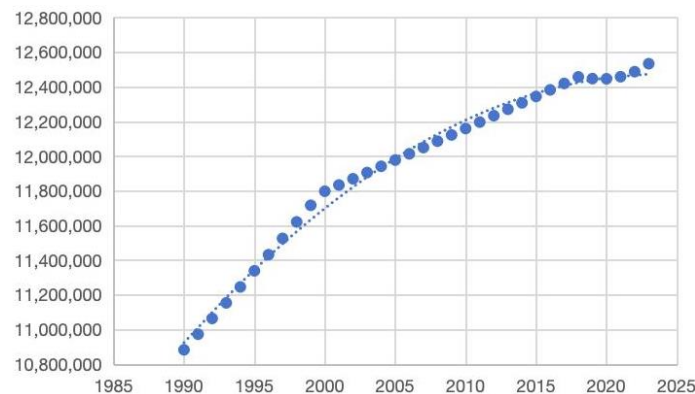
**Table 5.** Government fiscal expense in the next 10 years (Data credit: Original)

Year	2023	2024	2025	2026	2027	2028	2029	2030	2031	2032
Expense (RMB)	109360	97355	86667	77152	68682	61142	54430	48455	43135	38400

Despite rising demand for electric buses, Beijing Public Transit Group covers procurement costs with ample revenue, earning 13.3 billion over a decade without subsidies. Our model predicts Tokyo's successful integration, while Los Angeles, initially short on buses, can complete the plan by 2035 with 66.7% financial assistance. This is because Los Angeles needs to buy a large number of buses and charging piles in a short time. Table 6 is the prospect for the future consumption of buses and charging piles. Figure 2 is the population of Los angeles from 1990 to 2023. Table 7 is the data of future expectation of buses in Los Angeles. Table 8 is Tokyo future prediction.

**Table 6.** The prospect for the future consumption of buses and charging piles

	Number of buses	Number of charging piles
2022	23456	5864
2023	24553	6138
2024	25701	6425
2025	26902	6726
2026	28160	7040
2027	29476	7369
2028	30855	7714
2029	32297	8074
2030	33807	8452
2031	35388	8847
2032	37042	9261
2033	38774	9261



**Figure 2.** The population of Los angeles from 1990 to 2023 (Photo/Picture credit: Original)



**Table 7.** Data of future expectation of buses in Los Angeles

Year	Number of buses	Number of charging pile	Spend	Income	Income minus Expense
2020	4000	571	404000	354750	660250
2021	4640	662	468640	363738	622574
2022	5382	769	543622.4	372725	574552.6
2023	6243	892	630601.984	381713	514537.016
2024	7242	1034	731498.3014	390700	440601.6986
2025	8401	1200	848538.0297	3999688	11150525.97
2026	9745	1392	984304.1144	408675	241720.8856
2027	11304	1615	1141792.773	417663	111196.2273
2028	13113	1873	1324479.616	426650	-44529.6163
2029	15211	2173	1536396.355	435638	-229482.355
2030	17645	2520	1782219.772	444625	-448344.771
2031	20469	2924	2067374.935	453613	-706535.935
2032	23744.1081	3392.01545	2398154.925	462600	-1010354.92
2033	27543.1654	3934.73792	2781859.713	471588	-1367095.71
2034	31950.0719	4564.29599	3226957.267	480575	-1785232.26
2035	37062.0834	5294.58335	3743270.43	489563	-2274581.43

**Table 8.** Tokyo future prediction (income-expense=147483 RMB)

Year	Number of buses	Number of charging pile	Spend	Income	Income minus Expense
2020	3280	546	331826.6667	264718.69	197610.7133
2021	3608	601	365009.3333	273706.17	182403.0067
2022	3968	661	401510.2667	282695.4788	163880.6909
2023	4365	727	441661.2933	291682.9642	141704.6351
2024	4802	800	485827.4227	300670.4496	115513.4765
2025	5282	880	534410.1649	309657.935	84905.70507
2026	5810	968	587851.1814	318645.4204	49439.65937
2027	6391	1065	646636.2996	327632.9058	8629.512031
2028	7030	1171	711299.9295	336620.3912	-38059.14713
2029	7734	1289	782429.9225	345607.8766	-91214.16928
2030	8507	1417	860672.9147	354595.362	-151482.1907
2031	9358	1559	946740.2062	363582.8474	-219574.5114
2032	10294	1715	1041414.227	372570.3328	-296273.5612

#### 4. Conclusion

To achieve carbon neutrality and reduce carbon emissions, the utilization of clean energy is imperative. Over the next decade, the number of fuel-powered buses is expected to gradually decrease, giving way to their electric counterparts. Concurrently, sustained population growth is anticipated, resulting in an upward trend in the demand for public transportation. This study asserts that public transit agencies predominantly lean towards the procurement of new energy electric buses when acquiring new vehicles. Notably, the paper does not delve into the subsidies and income derived from the phase-out of diesel buses, as transit agencies have already incurred corresponding (or even greater) costs during the initial purchase of these vehicles. The model proposed in this study posits mainly about that the annual acquisition of new electric buses and charging stations is contingent upon the budget for the year and

the previous year's expenditure of the transit company. Simultaneously, the research refrains from an in-depth discussion on the impact of government subsidies, as per our model's predictions, the fiscal revenue of the transit agencies is anticipated to sufficiently cover the procurement of charging stations and electric buses, along with the maintenance costs. This elucidation underscores the significance of decision-making and fiscal feasibility in transitioning to new energy sources in the public transportation sector, providing robust theoretical support for future urban transportation planning.

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