

# An Analysis of Energy-Related CO2 Emissions in North Carolina and US.

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## Contents

github repository . . . . .	3
<b>Rationale and Research Questions</b>	<b>4</b>
<b>Dataset Information</b>	<b>5</b>
<b>Exploratory Analysis</b>	<b>6</b>
Comparison through the GDP perspective . . . . .	6
Comparison through the GDP per capita perspective . . . . .	8
<b>Analysis</b>	<b>9</b>
Question 1: <What are the primary sources of CO2 emissions in North Carolina?> . . . . .	9
Question 2:<How do CO2 emissions within states with similar GDP growth compare to North Carolina, and if a stricter state climate policy improves their performances?> . . . . .	13
Comparison through State Climate Policies . . . . .	19
<b>Summary and Conclusions</b>	<b>20</b>
<b>References</b>	<b>21</b>

# Contents

## List of Figures

1	Kuznets Curve . . . . .	6
2	CO2 Emissions by log GDP. US States 2009 . . . . .	7
3	CO2 Emissions by log GDP. US States 2019 . . . . .	7
4	CO2 Emissions by log GDP per capita. US States 2009 . . . . .	8
5	CO2 Emissions by log GDP per capita. US States 2019 . . . . .	9
6	North Carolina. Total CO2 Emissions by sector. 2009-2019 . . . . .	10
7	North Carolina Total CO2 Emissions by sector 2009-2019 . . . . .	11
8	North Carolina Total CO2 Emissions by sector 2009-2019 . . . . .	12
9	CO2 Emissions in 2019 by State and by GDP . . . . .	13
10	Comparison of GDP and CO2 Emissions for 2019 . . . . .	14
11	Georgia. Total CO2 Emissions by sector. 2009-2019 . . . . .	15
12	Georgia. CO2 Emissions in each Sector by fuel type. 2009-2019 . . . . .	16
13	Virginia. Total CO2 Emissions by sector. 2009-2019 . . . . .	17
14	Virginia. CO2 Emissions in each Sector by fuel type. 2009-2019 . . . . .	18

## github repository

<https://github.com/yangeline/YangMartinezAlvarezPang.git>

## Rationale and Research Questions

Energy consumption, particularly the burning of fossil fuels for electricity, heat, and transportation, is a significant contributor to global CO<sub>2</sub> emissions. The urgency of climate change, propelled by rising levels of CO<sub>2</sub> emissions, needs a detailed understanding of emission sources, patterns, and impact.

Understanding these emissions on a granular level, such as by state and sector, is critical for developing effective mitigation strategies. North Carolina, like many states, faces its unique challenges and opportunities in managing CO<sub>2</sub> emissions due to its specific industrial activities, energy mix, and policy environment.

Given the vast amount of data available, there's a pressing need for analytical tools that can simplify this complexity into actionable insights. By leveraging R, a powerful tool for data analysis, this project aims to provide a comprehensive analysis of North Carolina's CO<sub>2</sub> emissions within the wider context of the United States, identifying key areas for policy intervention and technological innovation.

### Research Questions

1. What are the primary sources of CO<sub>2</sub> emissions in North Carolina?
2. How do CO<sub>2</sub> emissions within states with similar GDP growth compare to North Carolina, and if a stricter state climate policy improves their performances?

## Dataset Information

The analysis of this paper is an attempt to rationalize why despite of having few fossil fuel resources and no coal production, and being one of the United States’ leading nuclear power-producing states, North Carolina ranked 13 in 2021 in total carbon dioxide (CO<sub>2</sub>) emissions (US Energy Information Administration -EIA-). We used the data for energy-related carbon dioxide emissions by state and their main sources by sector and fossil fuel, which most recent release was October, 2018.

On this regard, the EIA (2023) defines total state CO<sub>2</sub> emissions as those that include emissions “from direct fuel use across all sectors, including residential, commercial, industrial, and transportation, as well as primary fuels consumed for electricity generation.” On the other hand, energy-related CO<sub>2</sub> emissions refers to “emissions released at the location where fossil fuels are combusted”. From this information, we track patterns and define an area of opportunity for the state. We chose the years *2009 and 2019* to analyze changes in emissions’ patterns in the decade previous to the Covid-19 pandemic, which could lead to a temporary transformation in the patterns.

We also define a pair of comparable states in the US in terms of economic growth. To find the most suitable approach for the analysis, we explore the comparison from two perspectives: the first one uses the Gross Domestic Product (GDP) as indicator, while the second one takes the GDP per capita. In both cases, we see how North Carolina performs as CO<sub>2</sub> emitter when considering its economic size and, then, contrast their emission sources, patterns, and policy interventions. We used the GDP data by state, gathered by USAFacts from the US Bureau of Economic Analysis, while we estimate the State GDP per capita, using that information and the population data was taken from the Federal Reserve Bank of St. Louis (FRED).

	Data	Source
State Energy-related carbon dioxide emissions		EIA
Emission sources by sector and fossil fuel		EIA
	GDP	USAFacts
	Population	Federal Reserve Bank of St. Louis

## Exploratory Analysis

The Environmental Kuznets Curve (EKC) is the graph representation of the hypothesized relationship between income and environmental degradation as an economy grows. According to it, at early stages of economic growth, environmental degradation, and pollution increase but eventually, the relationship reverts so that at high-income levels the economic growth leads to environmental improvement (Leal, 2022). Thus, the EKC has an inverted U-shaped (figure below).

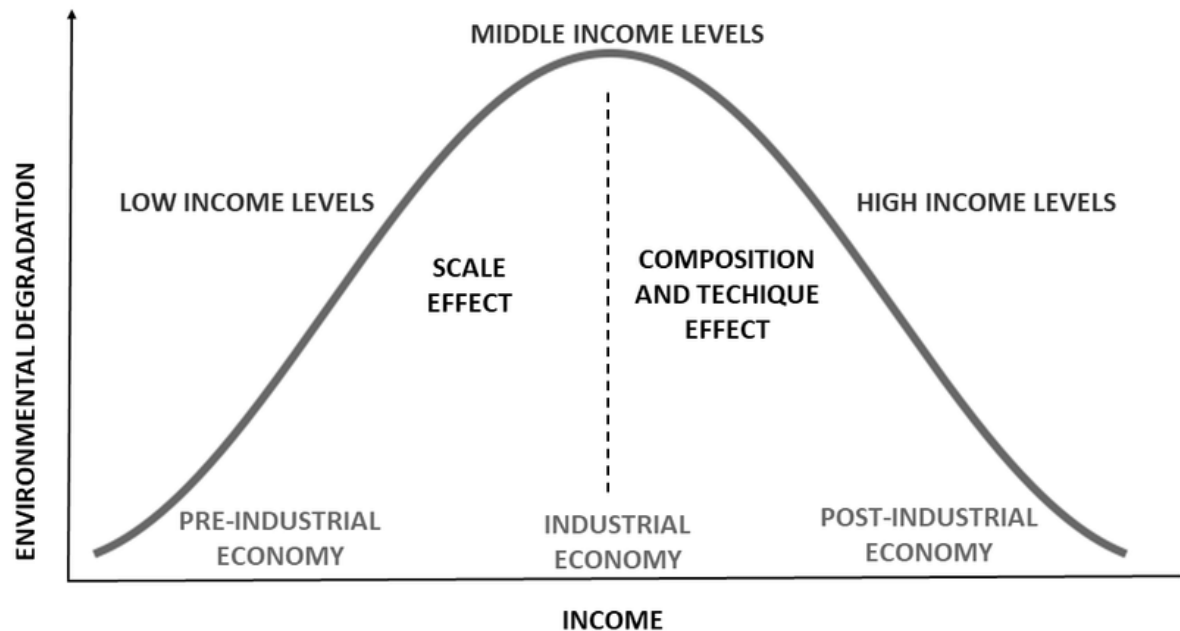


Figure 1: Kuznets Curve

Although this idea has been promoted as a method of improving the environment, EKC faces criticism. One of the drawbacks is that the EKC analysis focuses on the domestic production but overlooks consumption of externally produced goods that could impact on the environmental degradation (Leal, 2022: 1). Besides, as EKC attributes the changes solely to economic growth, omits that other factors, such as “green” regulation, and other policy interventions on human capital, renewable energy consumption, e.p., have to be taken for environmental improvement to happen (Wang et al., 2023).

Under this idea that mere economic growth does not drive to environmental improvement, we analyzed the energy-related CO<sub>2</sub> emission of North Carolina and two other states with similar economic size, breaking down the emissions sources and sectors, as well as environmental policy intervention. For this purposes, we defined a pair of states which could be comparable to North Carolina, according to their economic size.

## Comparison through the GDP perspective

For this analysis, we consider the GDP at current prices. 2009 is our baseline year as we aim to review the decade prior to Covid-19 pandemic, and we used log transformations to normalize the distribution. From the plot below, we can observe a positive correlation between our variables.

Using this indicator, we concluded that Georgia and Virginia could be comparable options, according to the following information:

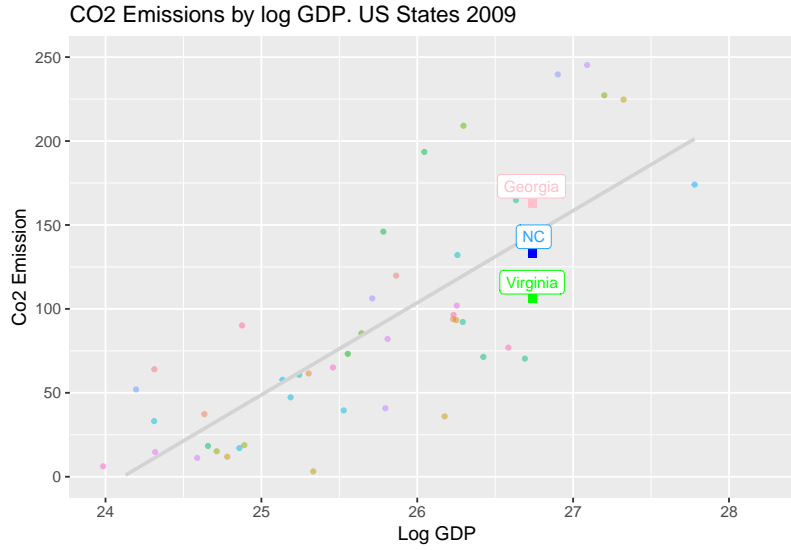


Figure 2: CO2 Emissions by log GDP. US States 2009

State	Log GDP
Georgia	26.738
North Carolina	26.742
Virginia	26.741

As we observe in the figure above, in 2009, while Georgia outperformed the expected level of energy-related CO2 emissions for its economic size, Virginia and North Carolina were below the trendline.

In contrast, in 2019, despite the general reductions in energy-related CO2 emissions, North Carolina emitted more CO2 than expected but remained closer to the trendline (figure below). Georgia remained above the trendline.

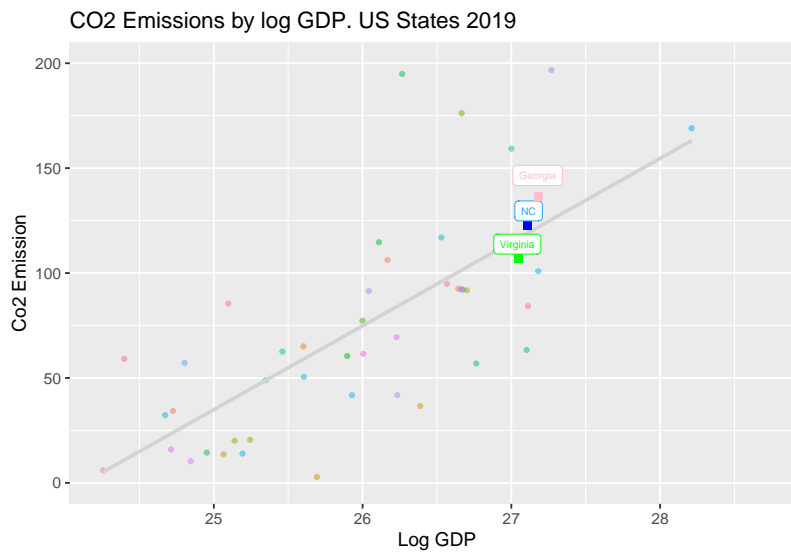


Figure 3: CO2 Emissions by log GDP. US States 2019

## Comparison through the GDP per capita perspective

We used GDP per capita (in log transformation), trying to see how this proxy for living standard translates into improvements in emissions levels. First, we observed that Georgia still results a good comparable, although Wisconsin results more similar from a point of view that uses this economic indicator.

State	Log GDP per capita
Georgia	10.659
North Carolina	10.681
Wisconsin	10.683

From the plot below, we can observe that the correlation between GDP per capita and the energy-related CO2 emissions is now negative, which would be reasonable as the GDP is an useful -but not the only one- indication of the average economic well-being of individuals, and as it grows we would expect that the environmental conditions improves (increasing well-being). However, it is worth noting that the correlation seems to be low. Still, North Carolina energy-related CO2 emissions would be higher than expected.

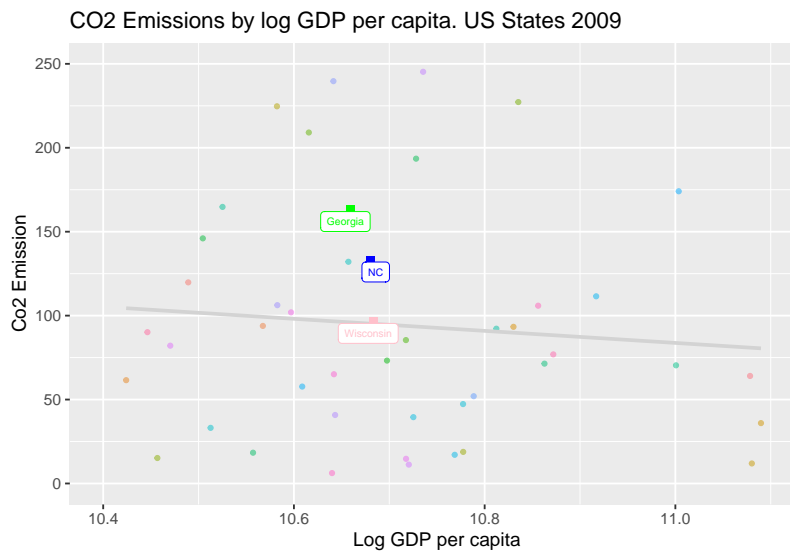


Figure 4: CO2 Emissions by log GDP per capita. US States 2009

In 2019, similar emission performance were observed by 2019: overall reductions, but North Carolina still emits more CO2 than expected, but below Georgia and above Wisconsin.



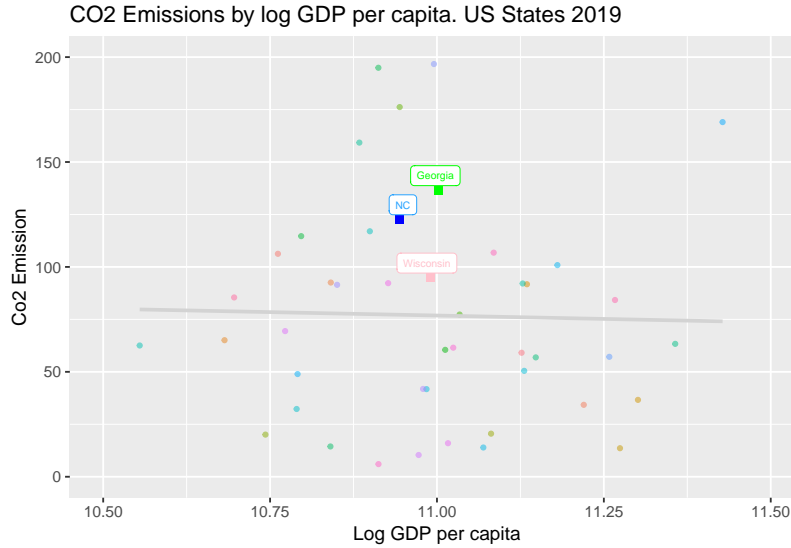


Figure 5: CO2 Emissions by log GDP per capita. US States 2019

## Analysis

Based on the relation between CO2 emissions and GDP -which shows a higher correlation than GDP per capita-, we could observe that, even though there were reductions from 2009 to 2019, North Carolina energy-related emissions are above the expected levels for an economy of its size. To look for opportunity areas we aim to analyze the main source and type of combusted fuels within the state, and later compare with Georgia and Virginia's patterns, as these latter resulted comparable by GDP in the previous section.

We should take into account that, according to its state's profile published by EIA, North Carolina consumes around four times more energy than it produces. Thus, the EIA's data can only give an insight on the emissions that derive from domestic production (combusted fuels within the state), but its contribution to CO2 emissions would be greater if those derived from its overall consumption were considered, depending on the type of energy that consumes from other state's production.

Notwithstanding, from the available data, we focus on the CO2 emissions from fuels combusted within the state (production).

### Question 1: <What are the primary sources of CO2 emissions in North Carolina?>

From the figure below, we can observe that electric power sector (yellow) and the transportation sector (pink) are the main sources of CO2 emissions in NC, highly above the emissions from residential, commercial and industrial sector. It is worth noting that although the electric power sector shows a downward trend in its emissions levels, the transportation sector -in the contrary- has been increasing its emissions.

The EIA explains that truckers who use motor gasoline and diesel fuel in NC, and the jet fuel consumed at Charlotte International Airport, one of the top 10 U.S. airports, made the transportation sector an intensive end-use energy-consumer. The interstate and internalization of the environmental impacts of this sector should go according to its emissions, and this could be an area of opportunity for the state of NC.

The figures below break down each sector's CO2 emission by fuel type. The increase in Co2 emissions from the transportation sector, is driven by the raise in petroleum products. We can observe as well in the bar graph for 2019, that transportation makes a very limited use of other fuel types. In the case of the electric power sector, there is still an opportunity area for reducing the use of coal.

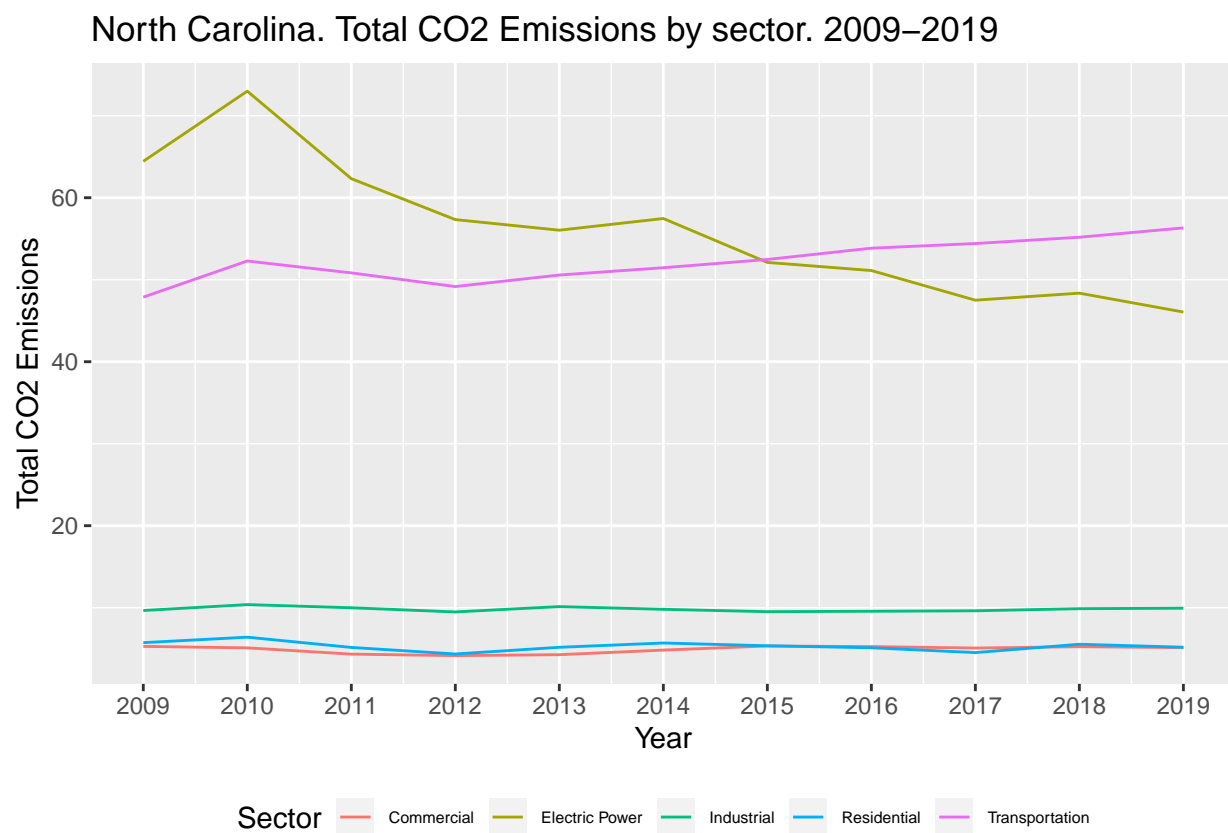


Figure 6: North Carolina. Total CO2 Emissions by sector. 2009-2019

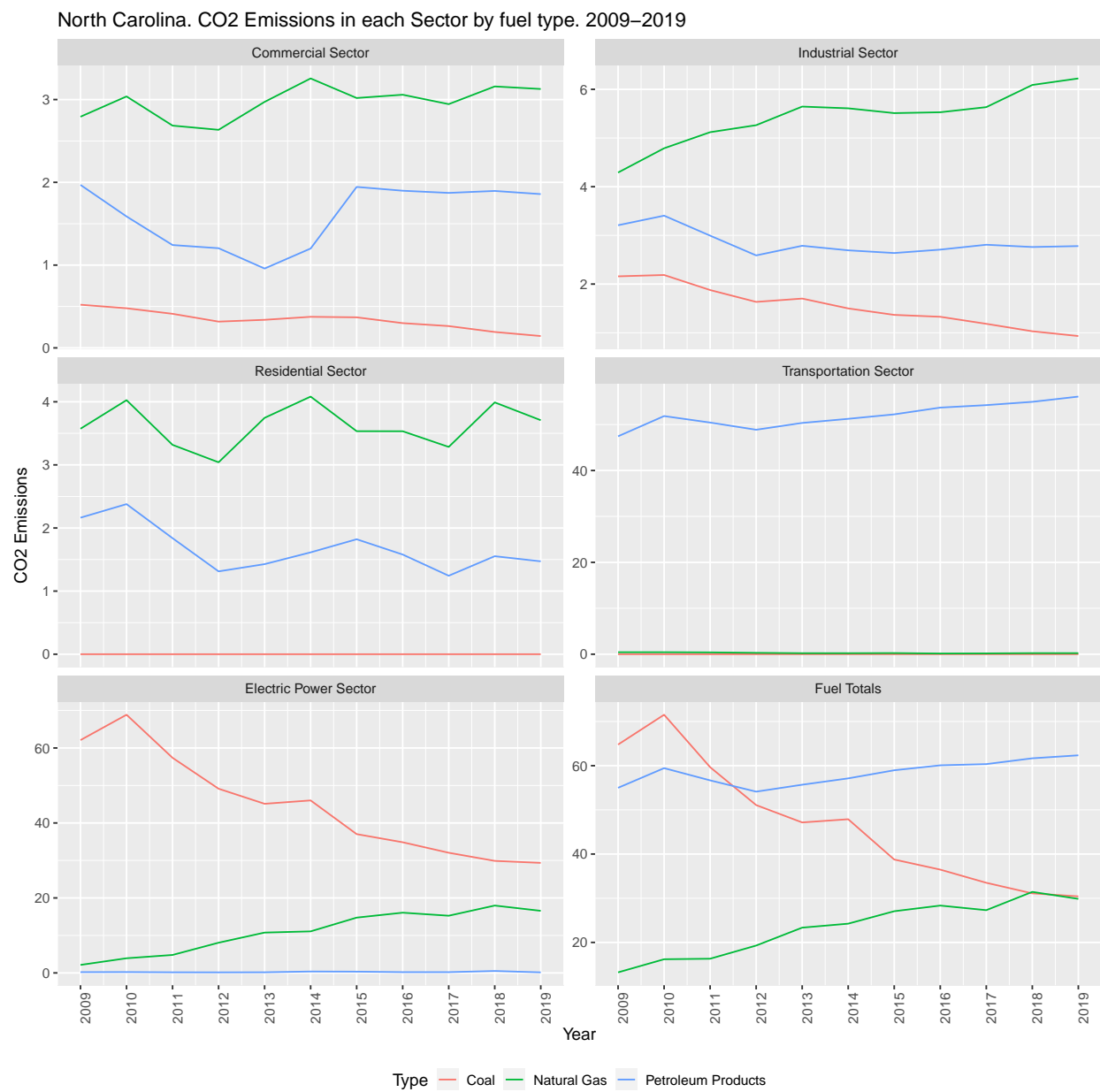


Figure 7: North Carolina Total CO2 Emissions by sector 2009-2019

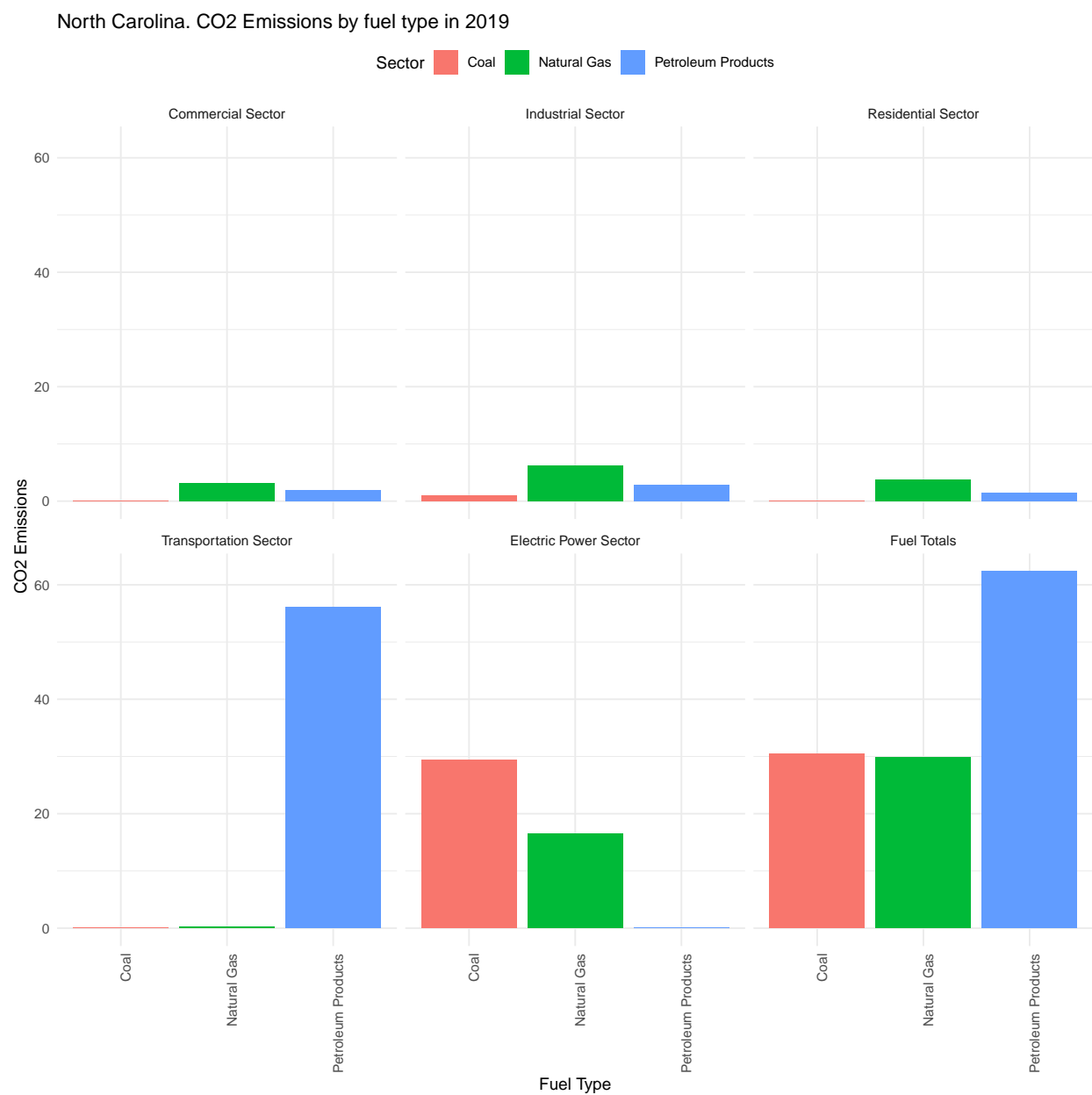


Figure 8: North Carolina Total CO2 Emissions by sector 2009-2019

**Question 2:<How do CO2 emissions within states with similar GDP growth compare to North Carolina, and if a stricter state climate policy improves their performances?>**

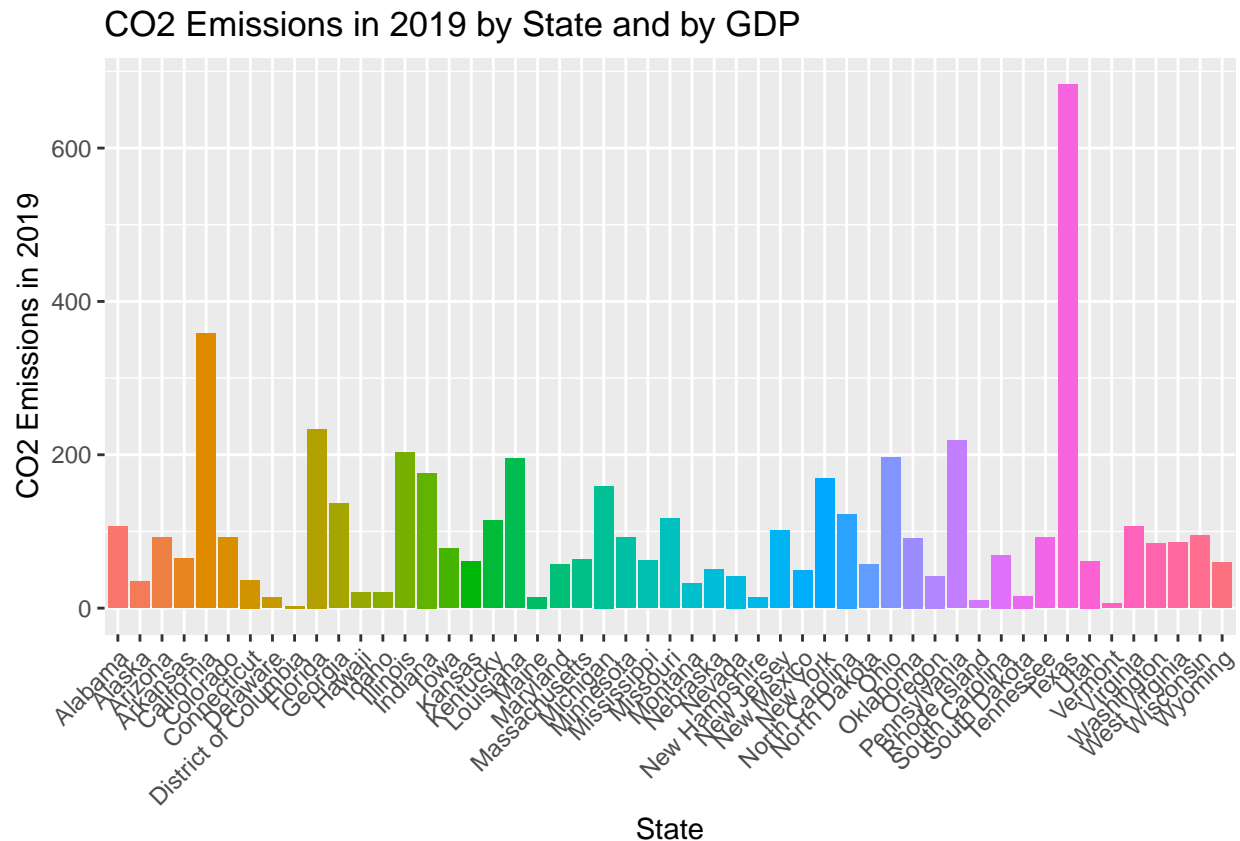


Figure 9: CO2 Emissions in 2019 by State and by GDP

The chart shows a wide disparity in CO2 emissions among the states, indicating that similar economic growth does not necessarily lead to similar levels of emissions. North Carolina appears to be on the lower end of the emissions spectrum relative to states like Georgia and Virginia, which have notably higher emissions. This suggests that North Carolina might be managing its growth in a more emission-efficient manner compared to the higher emitting states (Georgia and Virginia). North Carolina's position suggests that it is possible to have significant economic growth while maintaining relatively lower CO2 emissions. Investigating the measures that North Carolina has implemented could provide valuable insights into effective strategies for other states. States aiming to reduce their carbon footprint could analyze the energy policies, technological innovations, and regulatory frameworks of lower-emitting states as potential models for sustainable development. States with lower emissions can serve as benchmarks. Understanding their policy frameworks, energy strategies, and technological investments could inform other states' efforts to decouple economic growth from CO2 emissions.

As shown in the graph above, we can see that, in 2019, Georgia had the highest GDP and CO2 emissions among the three states, followed by North Carolina, and Virginia had the lowest GDP and CO2 emissions. Having drawn comparison in economic well-being and energy-related CO2 emissions between North Carolina, Virginia and Georgia, we will now look at the difference approaches of their climate policies.

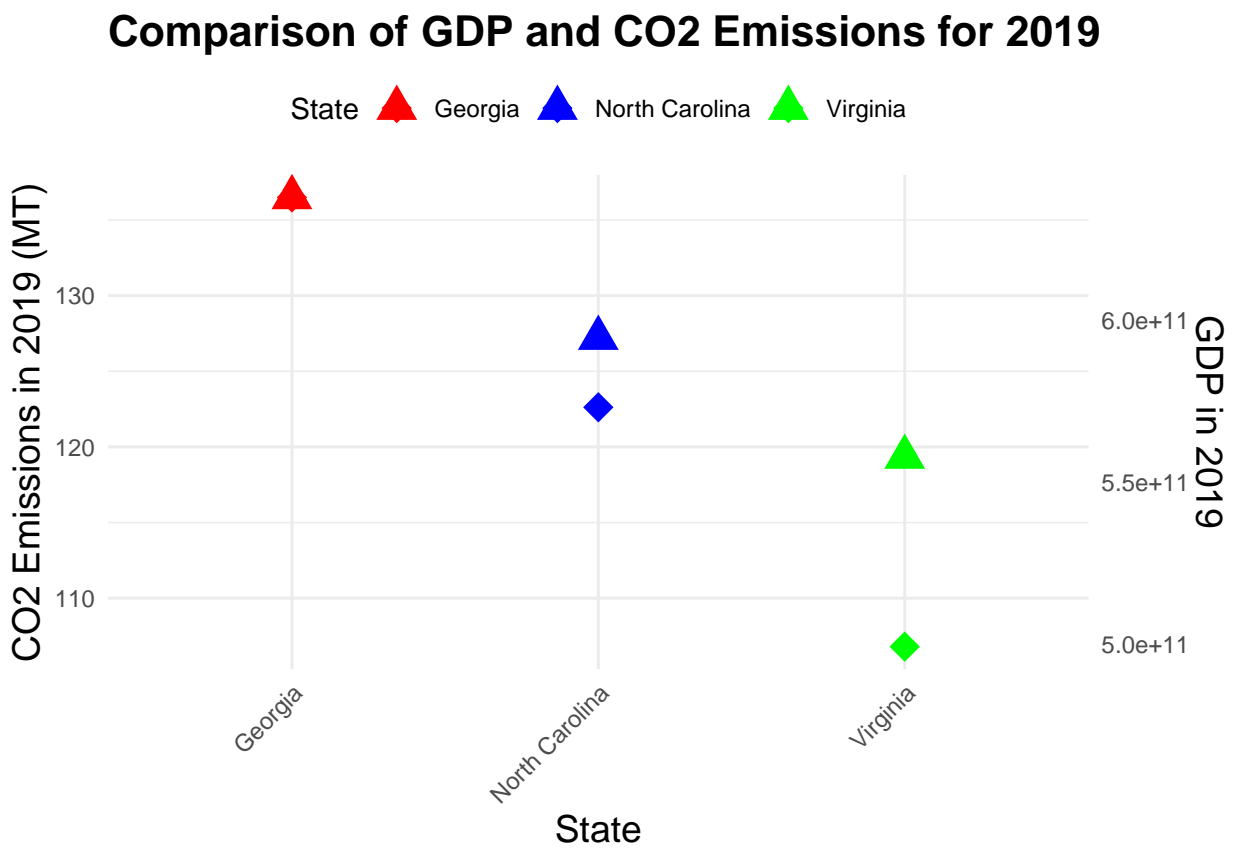


Figure 10: Comparison of GDP and CO2 Emissions for 2019

To briefly compare policy landscape between these states, we will be looking at three parts, whether they have Green House Gas (GHG) emission goals, Climate Action Plans, and how strictly have they been implemented. States that had their Green House Gas (GHG) emission goals written into statute, will be considered to be a more strict policy, and if a state only listed as an executive goal.

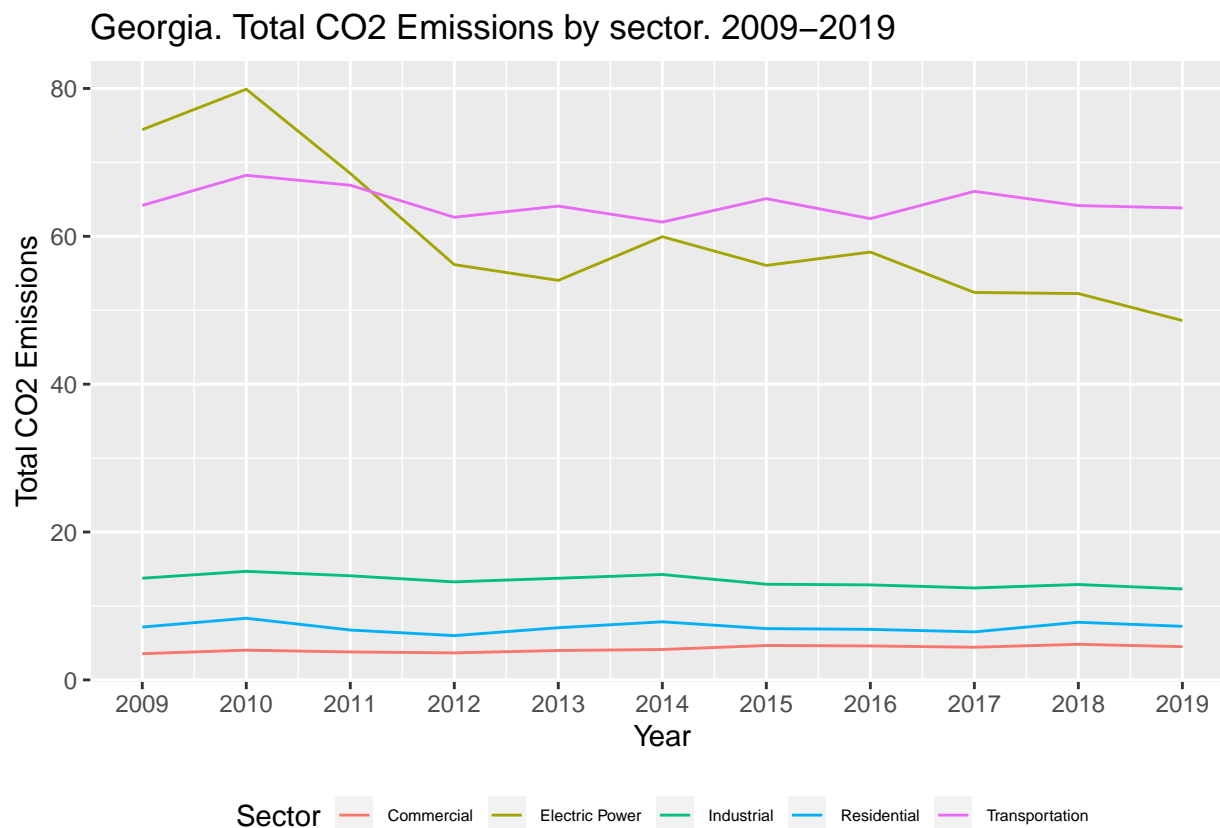


Figure 11: Georgia. Total CO2 Emissions by sector. 2009-2019

In Georgia, similar to North Carolina’s breakdown by sector, we observe that the transportation and electric power sectors are the main contributors to state CO2 emissions. However, in this case, while the electric power industry has been reducing its emissions levels, transportation has shown little variation over the analyzed decade.

In general, Georgia is increasing its use of natural gas in a more accelerated way than North Carolina.

In Virginia, similar to Georgia’s and North Carolina’s breakdown by sector, we observe that the transportation and electric power sectors are the main contributors to state CO2 emissions. The transportation sector has been showing a steady but small growth over the decade, while electric power has remained stagnant, with minor peaks and valleys and an apparent decline from 2016 to 2019.

Virginia is rapidly increasing its use of natural gas, while decreasing its reliance on coal, a trend that the other states also showed. The only sectors that show this trend are industrial and electric power. Residential and commercial, on the other hand, rely heavily on natural gas, while transportation sources almost all of its fuel from petroleum products.

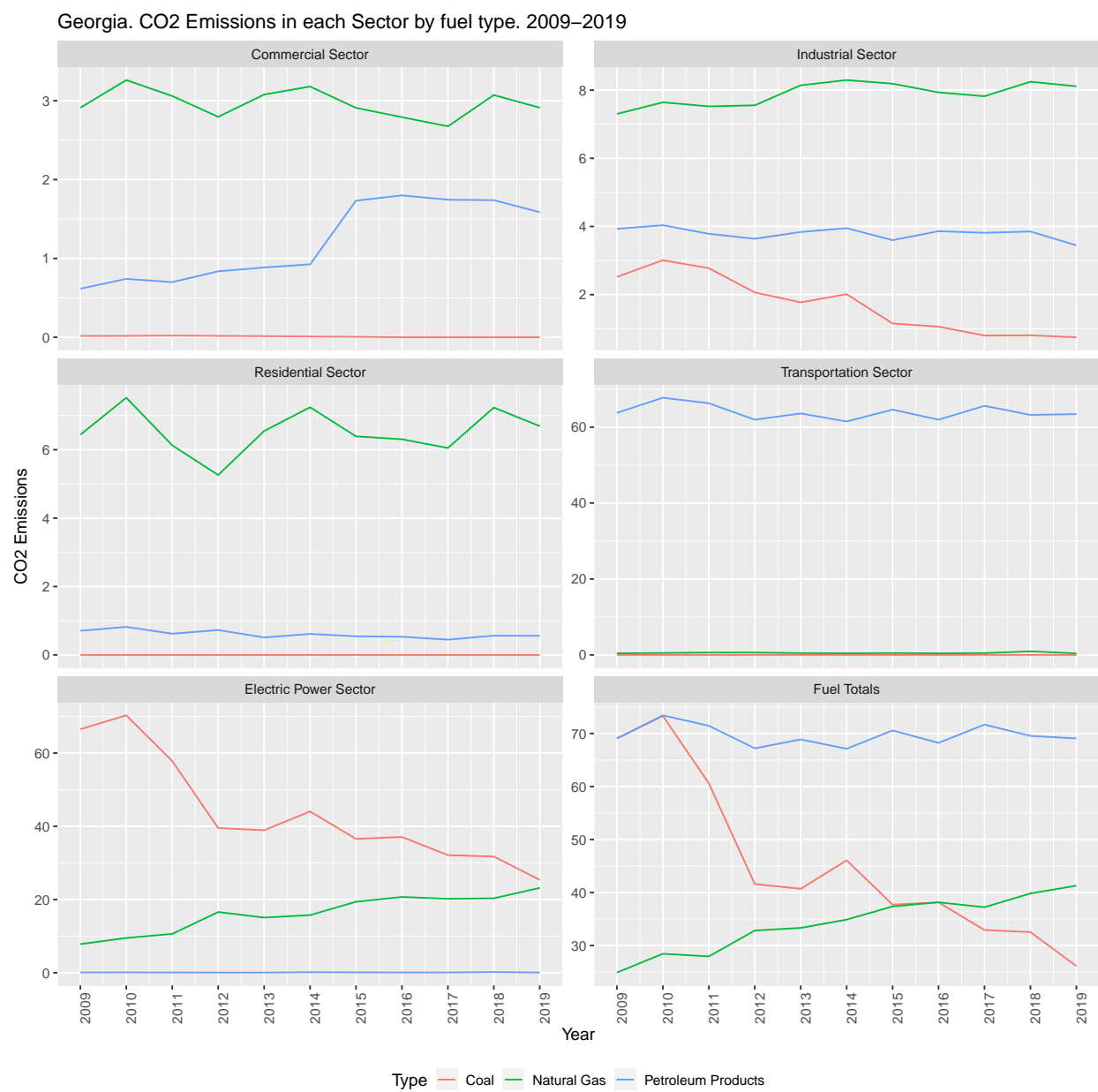


Figure 12: Georgia. CO2 Emissions in each Sector by fuel type. 2009-2019



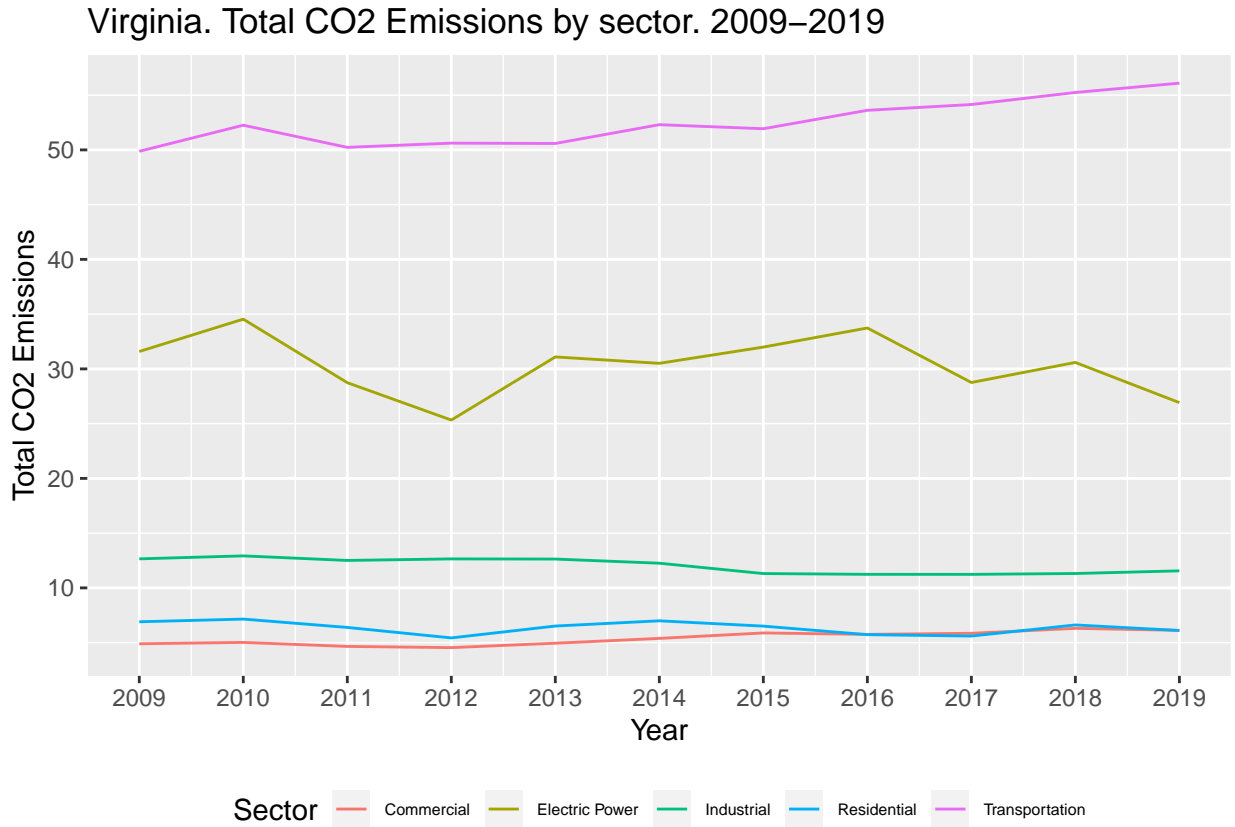


Figure 13: Virginia. Total CO2 Emissions by sector. 2009-2019

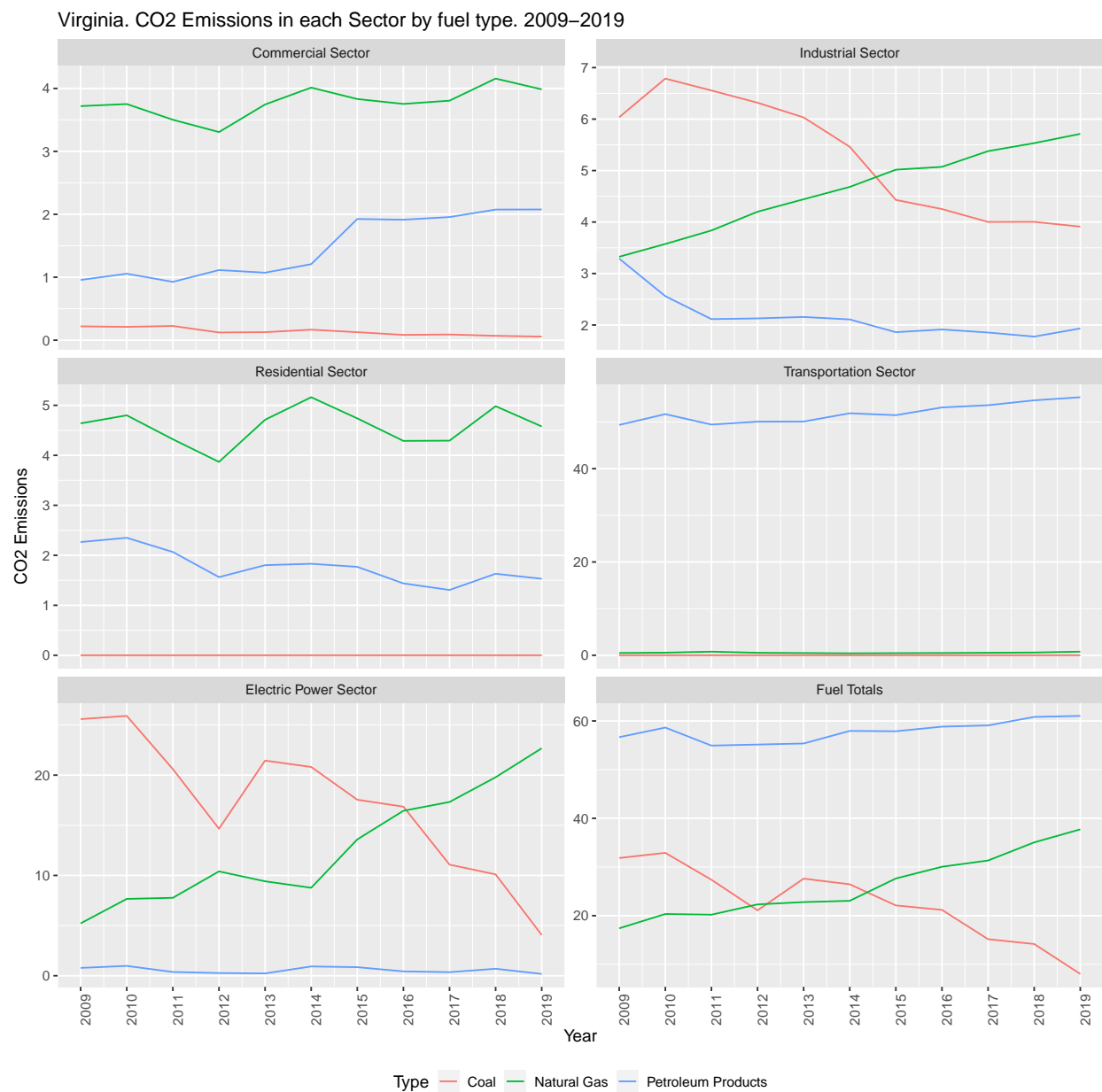


Figure 14: Virginia. CO2 Emissions in each Sector by fuel type. 2009-2019

## Comparison through State Climate Policies

### Virginia — the most strict

- GHG Emission goals:

Virginia enacted a statutory target (Senate Bill 94) in 2020 to achieve net-zero GHG emissions across all sectors by 2045. It also includes other aspects addressing climate change and the health, welfare, and safety of Virginians, including energy efficiency, distributed energy, mitigating the negative impacts of climate change and the energy transition on disadvantaged communities and prioritizing investment in these communities, ensuring reliability, among other topics.

- Climate Action Plan:

2022 Virginia Energy Plan focuses on achieving four objectives of Lower Cost of Living, Job Creation, Bringing People to Virginia, and an “All-of-the-Above” Approach to Energy Policy informed by energy affordability, reliability, capacity, competition, environmental stewardship, choice and innovation.

- Policy & Legislative effort:

The Virginia Clean Economy Act establishes renewable portfolio and energy efficiency standards, and advances offshore wind and solar generation, and the Clean Energy and Community Flood Preparedness Act addresses resiliency issues. The 2022 Plan found that Virginia has had a dramatic shift in electricity generation over the last ten years and is continuing to strive to reduce GHG emissions from the electric power sector as demonstrated by the state’s 2019 energy production targets and strategies to meet the targets outlined in VCEA. Virginia has also passed a number of recent bills to support climate actions, including the Clean Cars Act (House Bill 1965 of 2021).

### North Carolina — moderate

- GHG Emission goals:

North Carolina set an executive target in 2022 to reduce GHG emissions 50% below 2005 levels by 2030, and to reach net-zero GHG emissions as soon as possible but no later than 2050.

- Climate Action Plan:

In Executive Order 80, *North Carolina’s Commitment to Address Climate Change and Transition to a Clean Energy Economy*, Governor Roy Cooper laid out a series of goals for the state to strive to accomplish by 2025:

- Reduce statewide greenhouse gas emissions to 40% below 2005 levels
- Increase the number of registered, zero-emission vehicles (ZEVs) to at least 80,000
- Reduce energy consumption per square foot in state-owned buildings by at least 40% from fiscal year 2002-2003 levels

EO80 creates the Climate Change Interagency Council to help the cabinet agencies work together to achieve those goals.

### Georgia — the least strict

- GHG Emission goals:

Currently, along with other 24 states, Georgia doesn't have a state-level target or mandate to reduce emissions.

- Climate Action Plan:

They are developing their first road map to address climate change with \$3 million grant support from the federal Environmental Protection Agency (EPA). The state's priority plan is due in March, 2024, with the full plan due a year later.

At the glance, we can conclude that with less strict climate policies, or not even having one, is a major reason that the State of Georgia's economy were able to develop with less restrictions on CO2 emissions. On the other hand, even though Virginia's statutory target (Senate Bill 94) for Net-Zero was passed in 2020, considering the time needed for a bill to move forward in the legislative system, we can safely assume that there has been awareness and consensus across legislative and industrial representatives to address climate change in 2019.

## Summary and Conclusions

The analysis of energy-related CO2 emissions in North Carolina and the US conducted in this study sheds light on crucial insights regarding emission sources, patterns, and impacts. By delving into the primary sources of CO2 emissions in North Carolina, the study reveals the significant role of energy consumption, particularly from fossil fuels used for electricity, heat, and transportation. This granular understanding is essential for developing effective mitigation strategies to address the pressing issue of rising CO2 emissions contributing to climate change. Furthermore, the comparison of CO2 emissions within states with similar GDP growth to North Carolina highlights the importance of state climate policies in influencing emission performances. The study underscores the potential for stricter climate policies to drive improvements in emission levels and environmental outcomes.

Moreover, the analysis underscores the need for actionable insights derived from complex data sets to guide policy interventions and technological innovations in managing CO2 emissions. The study provides a comprehensive assessment of North Carolina's emission landscape within the broader context of the United States. This approach enables the identification of key areas for policy intervention and technological advancements to address the challenges posed by CO2 emissions. The study emphasizes the critical role of detailed analyses at the state and sector levels in formulating effective strategies to mitigate the impact of CO2 emissions on the environment.

In conclusion, by examining emission trends, sources, and policy implications, the analysis contributes valuable insights to the ongoing discourse on environmental sustainability and climate action. The findings underscore the importance of informed decision-making, policy coherence, and collaborative efforts at the state and federal levels to drive meaningful reductions in CO2 emissions and pave the way for a more sustainable and resilient future.

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