

2023 APEC Climate Symposium and Asia Pacific  
Climate Services Workshop Joint Conference

# Assessment of Climate Change Impact on South Korea's Electricity Demand with Uncertainty

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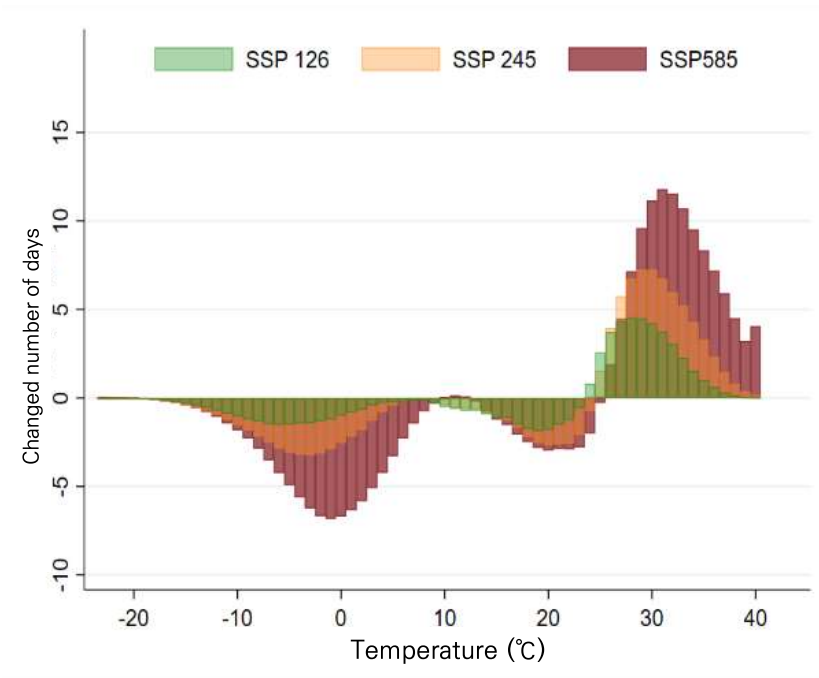
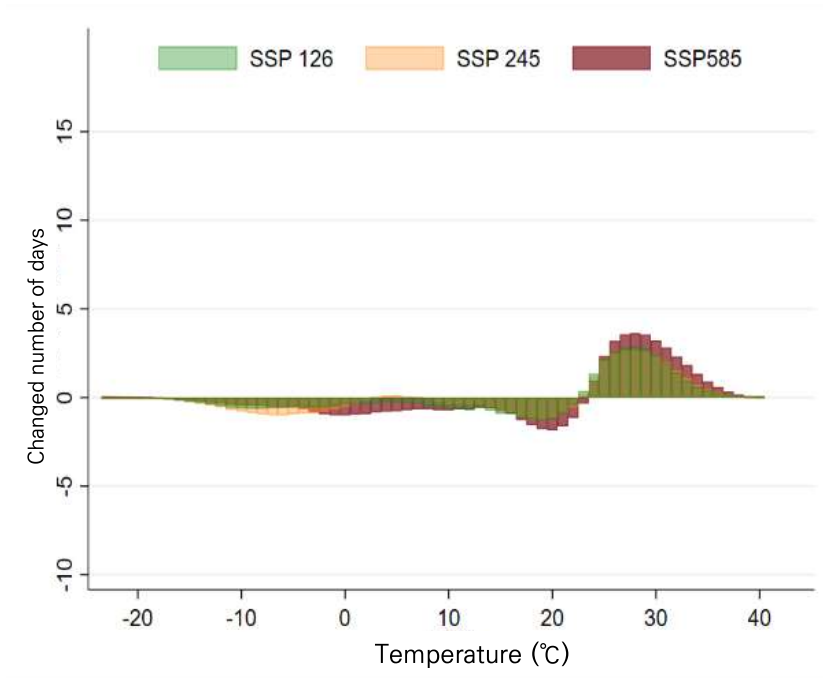
## II. Introduction

# Why do we care?

## 〈Change in Distribution of Temperature Bin due to Climate Change〉

〈2021~2040〉

〈2081~2100〉



How this change affect electricity consumption in S. Korea?

## Feature of this study

- Use the latest climate change scenarios

Scenarios	Period	Global Climate Models
SSP126, SSP245, SSP585	2021~2040, 2041~2060, 2081~2100	CanESM5 (CAN), GFDL-ESM4 (USA), ASSESS-ESM1-5 (AUS), 5ENSEM (KOR)

- Consider the uncertainty of climate change impacts
  - Uncertainties from the results of global climate models
  - Uncertainties from the results of econometrics analysis

- Estimate the temperature response curve as precise as possible
  - Used 4<sup>th</sup>-order polynomial to capture nonlinearity
  - Employed the fixed effect panel analysis to control omitted variable bias

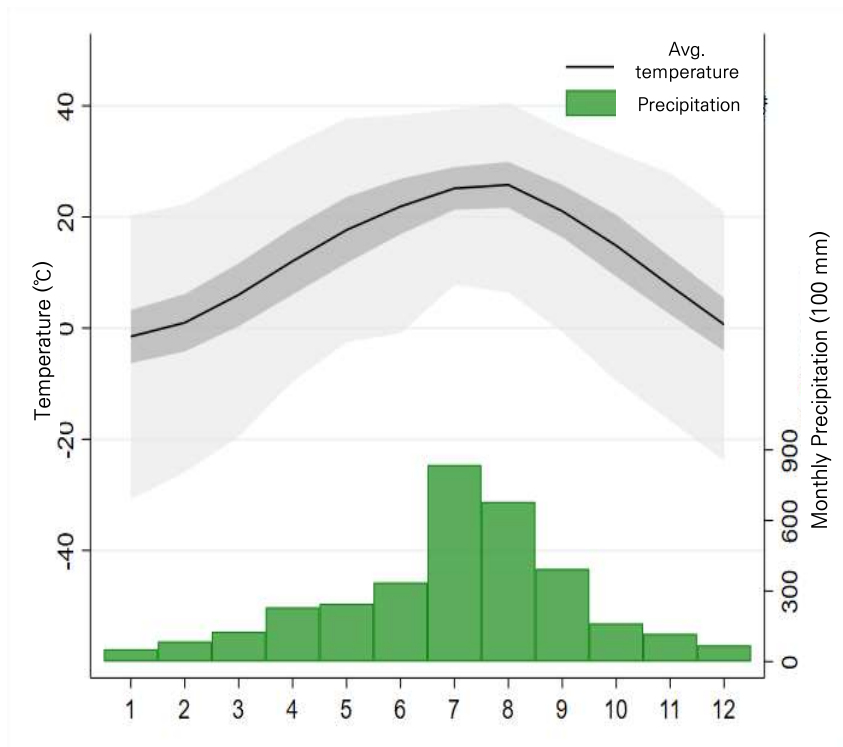
## II. Data

# Data

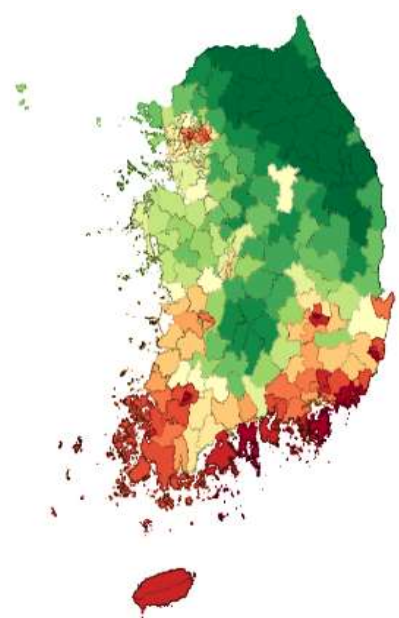
		Spatial unit	Time unit	Source	Note
Past weather information	Temperature (min, max), Precipitation	County	2011–2018, Daily	Korea Meteorological Administration (KMA)	<ul style="list-style-type: none"> <li>• MKPRISM from KMA</li> </ul>
Past electricity consumption	Monthly electricity consumption, number of contract	County	2011–2018, Monthly	Korea Electric Power Corporation (KEPCO)	<ul style="list-style-type: none"> <li>• Residential sector</li> <li>• General sector</li> </ul>
Future weather information	Temperature (min, max), Precipitation	County	2021–2100, Daily	KMA, IWMI	<ul style="list-style-type: none"> <li>• CanESM5 (Canada)</li> <li>• GFDL-ESM4 (US)</li> <li>• ASSESS-ESM1-5 (AUS)</li> <li>• 5ENSEM (S. Korea)</li> </ul>

# Climate in South Korea

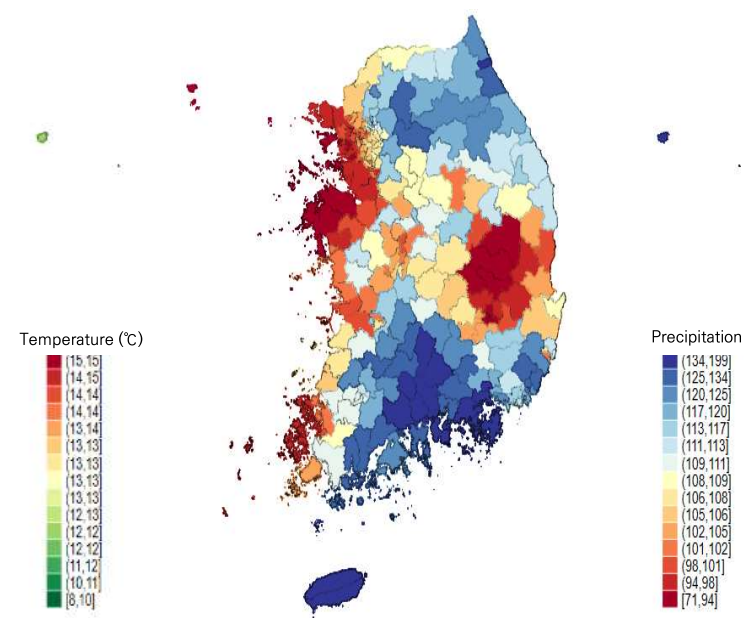
〈Average Temperature and Precipitation (2000~2019)〉



〈Average Temperature〉

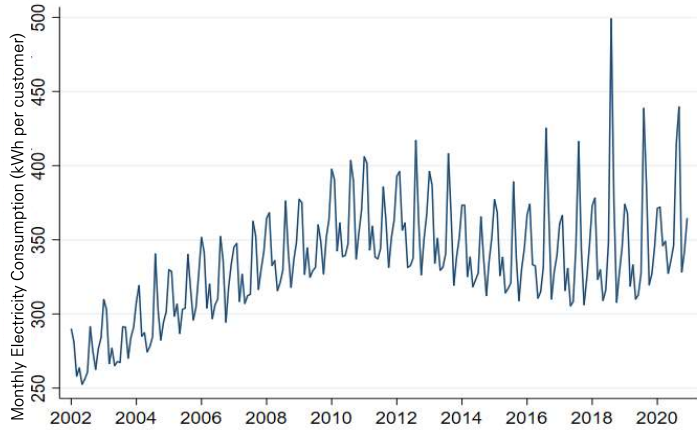


〈Monthly Average Precipitation〉

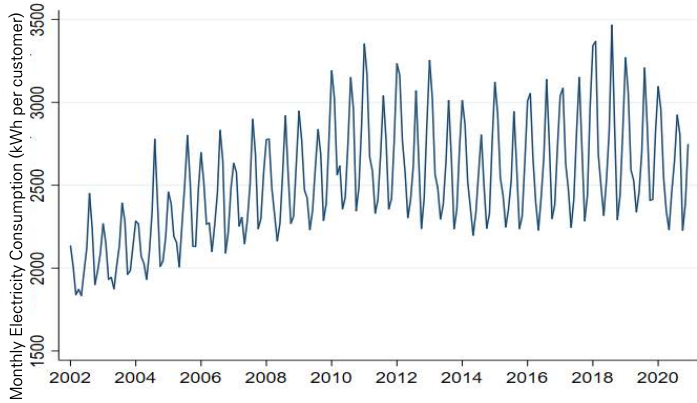


# Past Electricity Consumption in South Korea

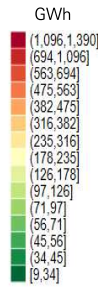
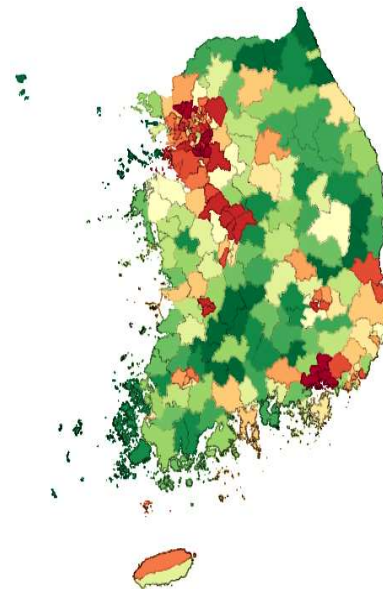
〈Residential Sector〉



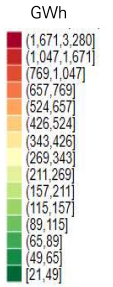
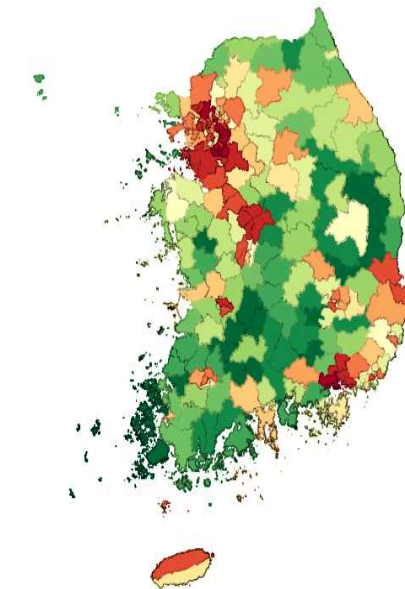
〈General Sector〉



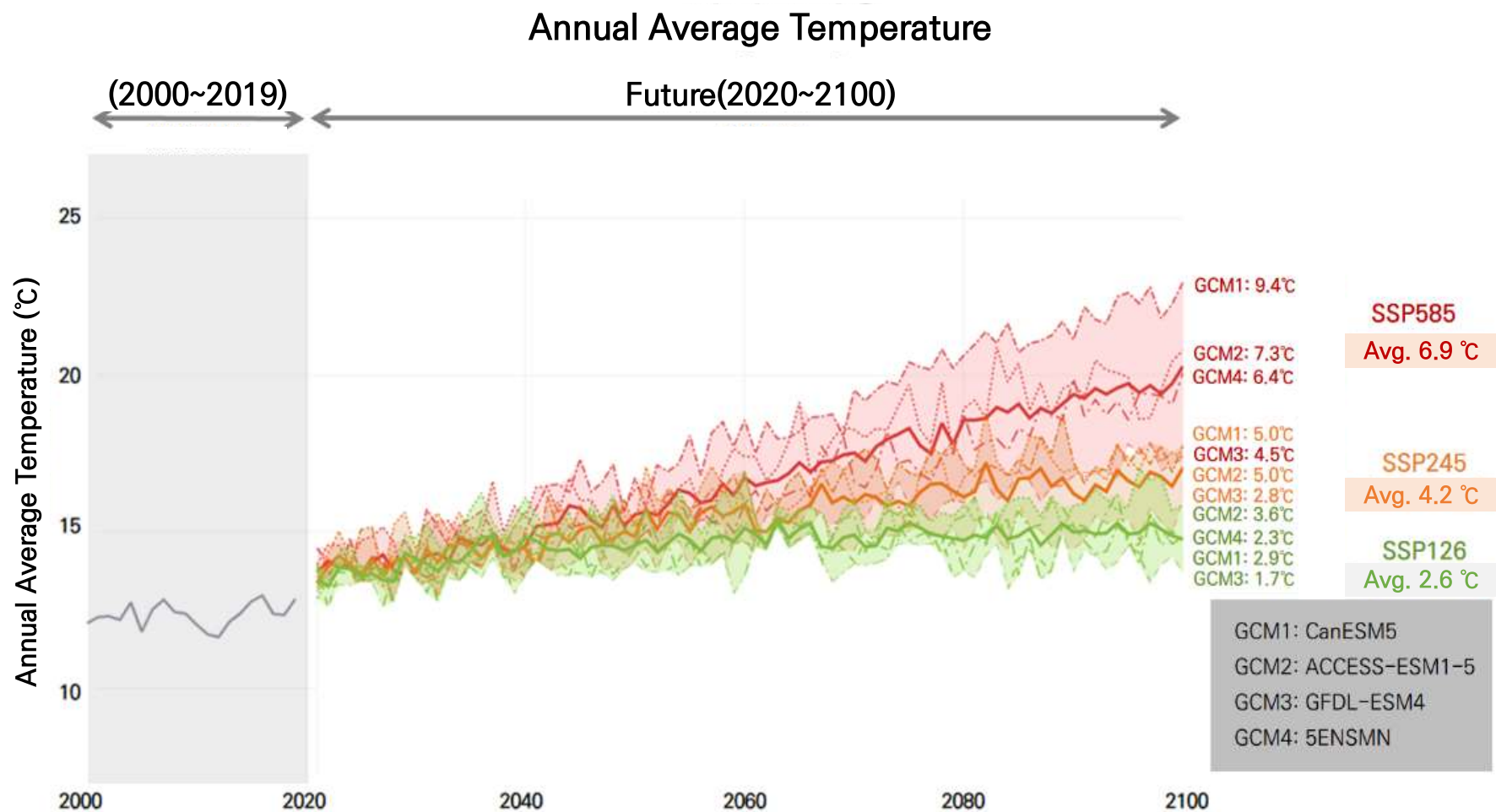
〈Residential Sector〉



〈General Sector〉



# Climate Change in South Korea



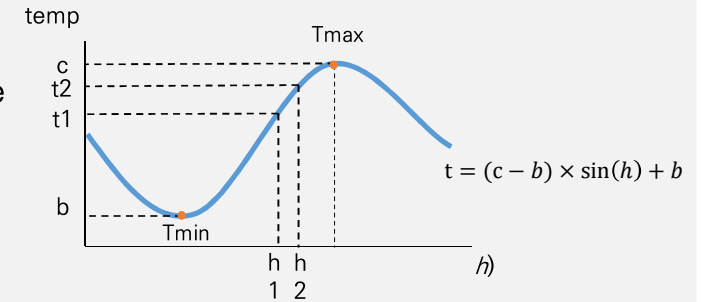
## III. Method

# Method(1)

## 1. Construct temperature bin

- Convert daily temperature to hourly temperature
- Construct monthly temperature bin by using hourly temperature

$$Tbin_{t,j}^{temp} = \sum_{d=1}^D x_{d,j}^{temp} \quad \forall t = \sum_{d=1}^{D \in \{30,31\}} d$$



## 2. Estimate temperature response curve

- Analyze the relationship between electricity consumption and temperature bin
  - Use 4<sup>th</sup>-order polynomial to reflect the nonlinearity
  - Use the fixed effects to control omitted variable bias

$$y_{i,t} = \beta_0 + \beta_j \cdot f_j(h, Tbin_{i,t}^h) + P(prcp) + \delta_i + \tau_t + \varepsilon_{i,t}$$

$$f_j(h, Tbin_{i,t}^h) = f_j \left( \sum_{h=-20}^{40} h \times Tbin_{i,t}^h \right) \quad \text{and} \quad P(prcp) = \gamma_1 \cdot prcp_{i,t} + \gamma_2 \cdot prcp_{i,t}^2$$

- $y_{i,t}$  : county-level monthly electricity consumption per customer
- $\beta_j$  : coefficient of each order in function  $f$
- $\delta_i$  : county-level fixed effect
- $\tau_t$  : time fixed effect
- $\varepsilon_{i,t}$  : error

## Method(2)

3. Compute future electricity consumption change with climate change scenarios

- Compute the change in temperature bin in each scenario
- Compute the change in electricity consumption by using the temperature response curve and future temperature bin change

$$\Delta y_{i,t+1} = \sum_{h=-20}^{40} \alpha_h \times \underbrace{(Tbin_{i,t+1}^h - Tbin_{i,t}^h)}_{\text{change in temperature bin between t and t+1}}$$

- $\Delta y_{i,t+1}$ : the change in electricity consumption per customer in county-level
- $\alpha_h$ : coefficient of temperature bin  $h$
- $Tbin_{i,t+1}^h$ : the exposed time in each temperature bin at time t+1
- $Tbin_{i,t}^h$ : the exposed time in each temperature bin at time t

4. Consider uncertainty

- Randomized simulation with the assumption that GCMs and coefficients in the temperature response curve are distributed in a certain shape

- Uncertainty from GCMs

$$P(GCM_i) = p$$

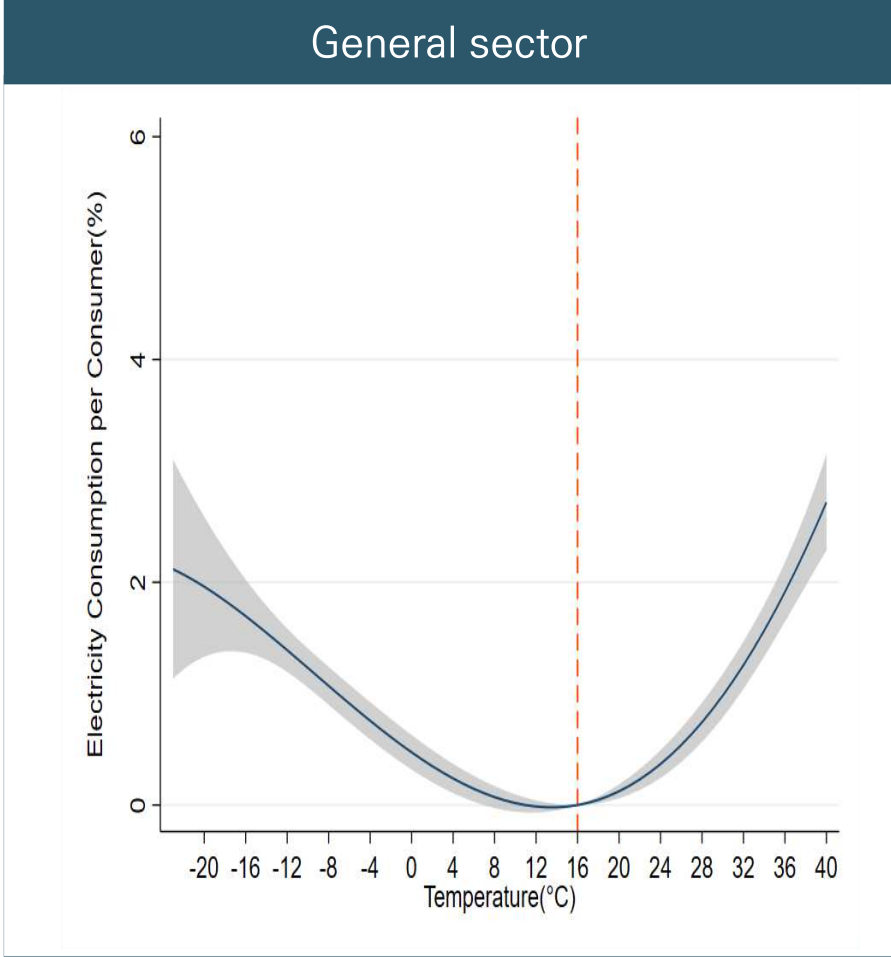
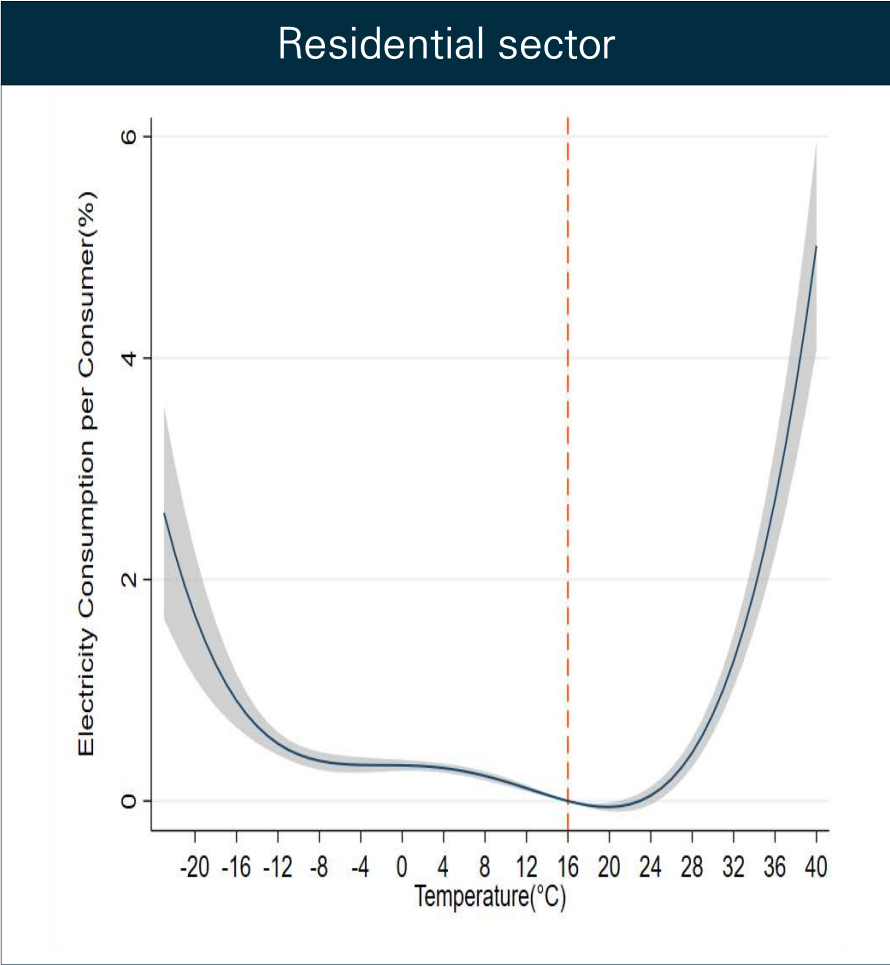
$$\sum P(GCM_i) = 1$$

- Uncertainty from econometric analysis

$$N \sim (\alpha_h, \delta_h)$$

## IV. Result

# Temperature Response Curves

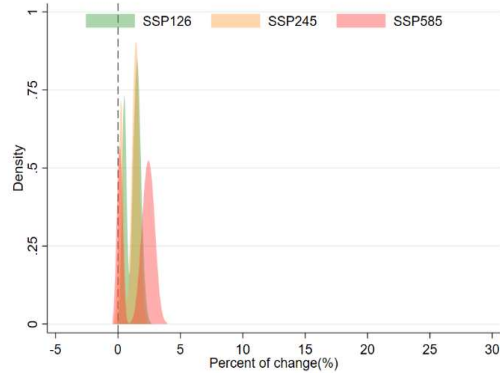


# Future Electricity Consumption Changes

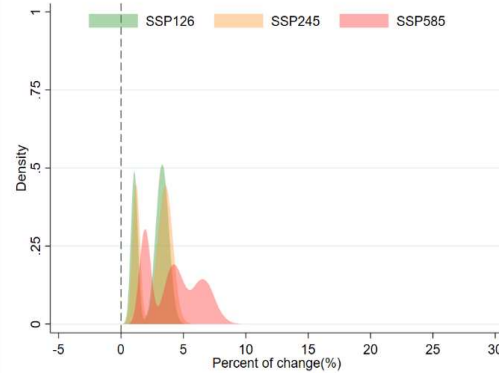
Residential sector

General sector

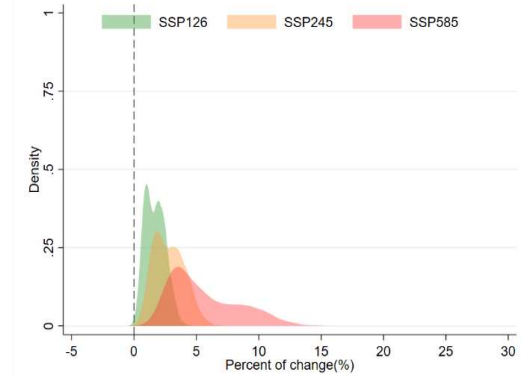
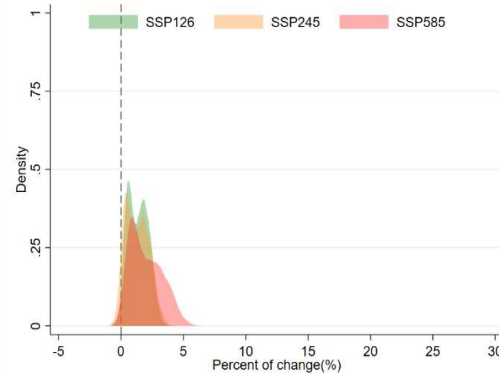
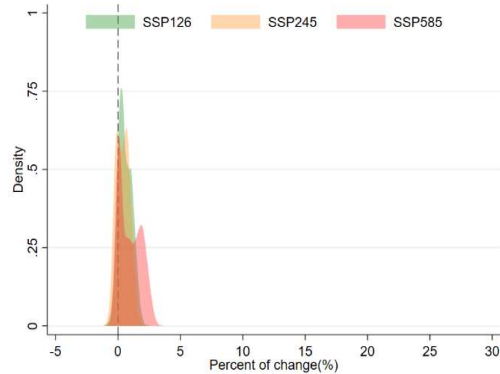
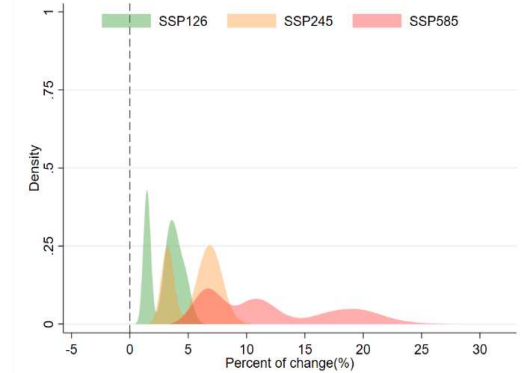
2021~2040



2041~2060



2081~2100

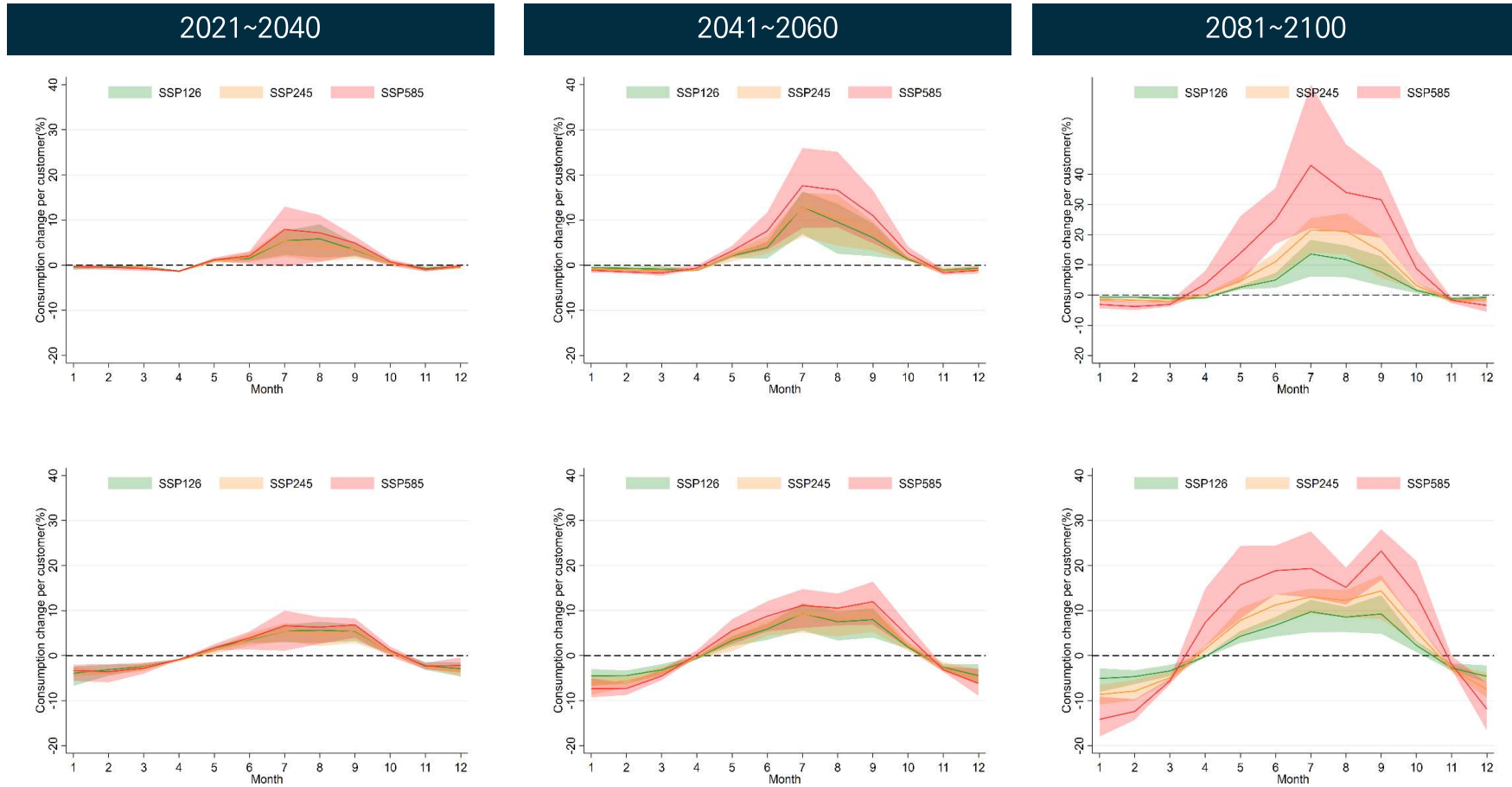


- Both sectors' electricity consumption will increase in the future.
- The magnitude of changes depends on the period and SSP scenarios.
- Uncertainty will grow over time.
- The highest increase in electricity consumption is projected under SSP585 during 2081–2100, with the greatest uncertainty.

# Predicted future electricity consumption in different months

Residential sector

General sector

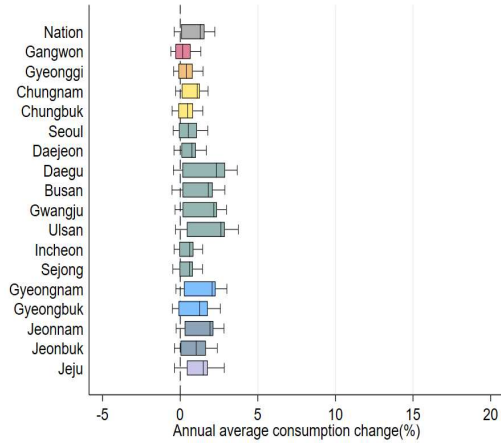


- Electricity consumption significantly increases in summer
- Predicted decrease in electricity consumption during winter

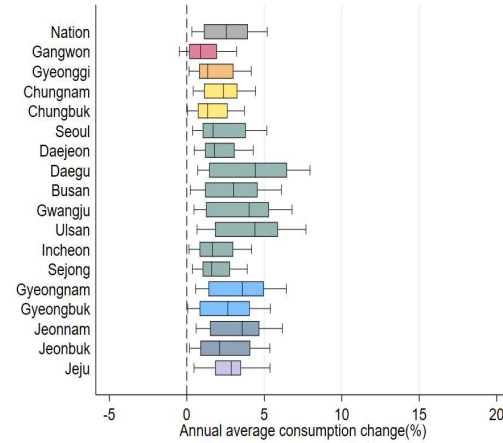
# Future Residential Electricity Consumption Change in Different Regions

SSP585

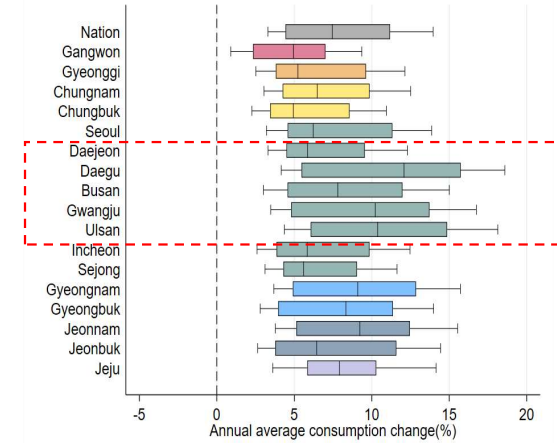
2021~2040



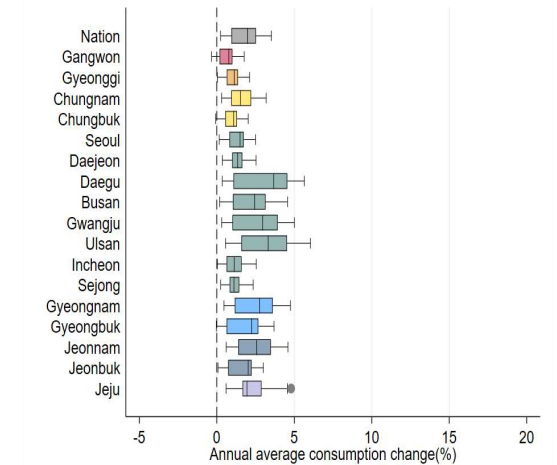
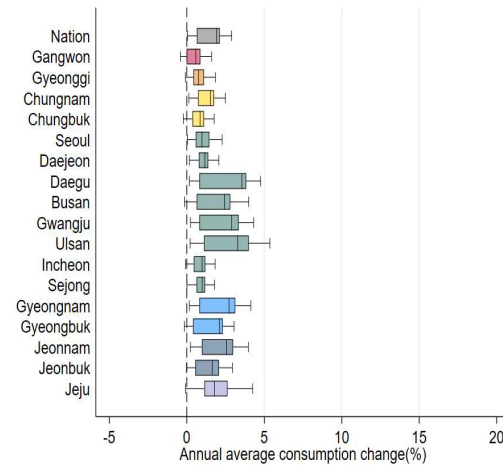
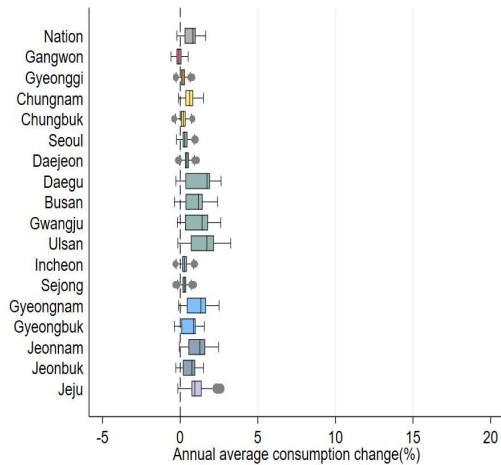
2041~2060



2081~2100



SSP126



## V. Conclusion

## Conclusion

- Residential and general electricity consumption are temperature-sensitive
- Climate change will increase electricity consumption in South Korea

	Time: 2081~2100		
	SSP126	SSP245	SSP585
Residential Sector	1~7%	2~10%	4~27%
General Sector	1~4%	1~8%	1~15%

- Climate change impacts vary by season, increasing summer consumption and decreasing winter consumption
- Electric company may need to expand their generation facilities to fulfill increase summer demand, which will raise the cost of providing electricity

**Thank you**