



# Forecasting Global Environmental Trends (2000 – 2023)

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# Research Objective



## Research Question

*How can we forecast USA temperature trends using historical environmental data?*



## Rationale

- Understand long-term climate patterns
- Identify key environmental drivers of temperature change
- Apply forecasting models to predict future trends

# Is This a Time Series Dataset?

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Annual  
measurements  
(2000–2024)



Consistent,  
longitudinal data per  
country



Suitable for  
forecasting models  
like ARIMA, ETS, and  
Linear Regression

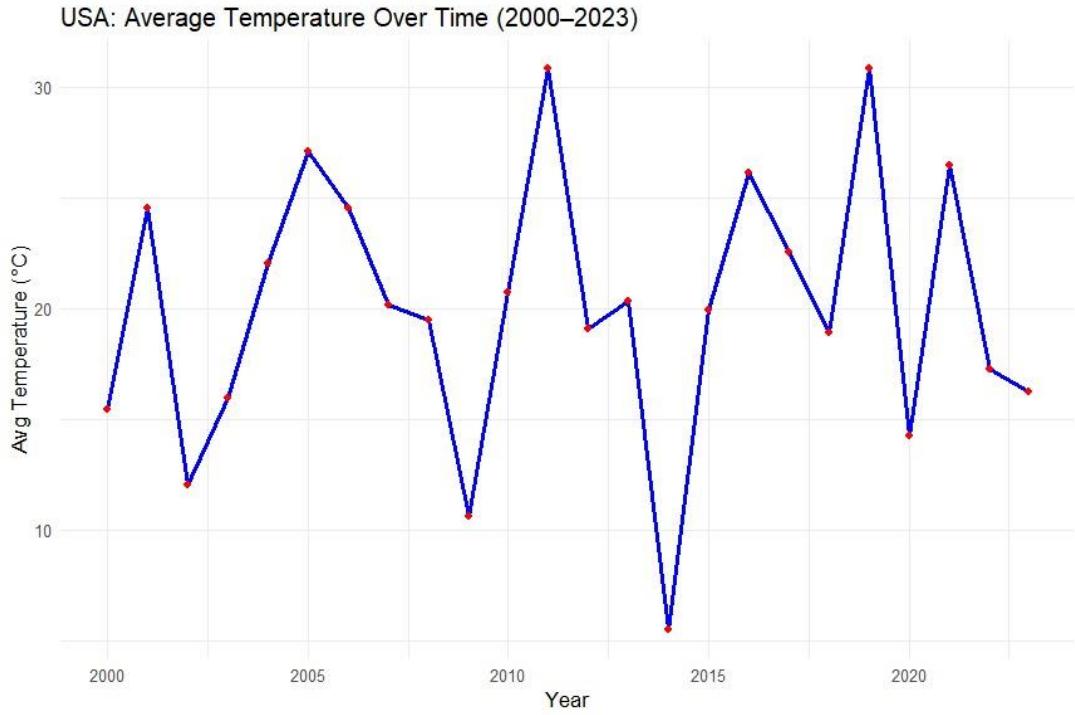
**\*\* Models chosen based on trend, seasonality, and data properties \*\***

# Dataset Overview & Insights



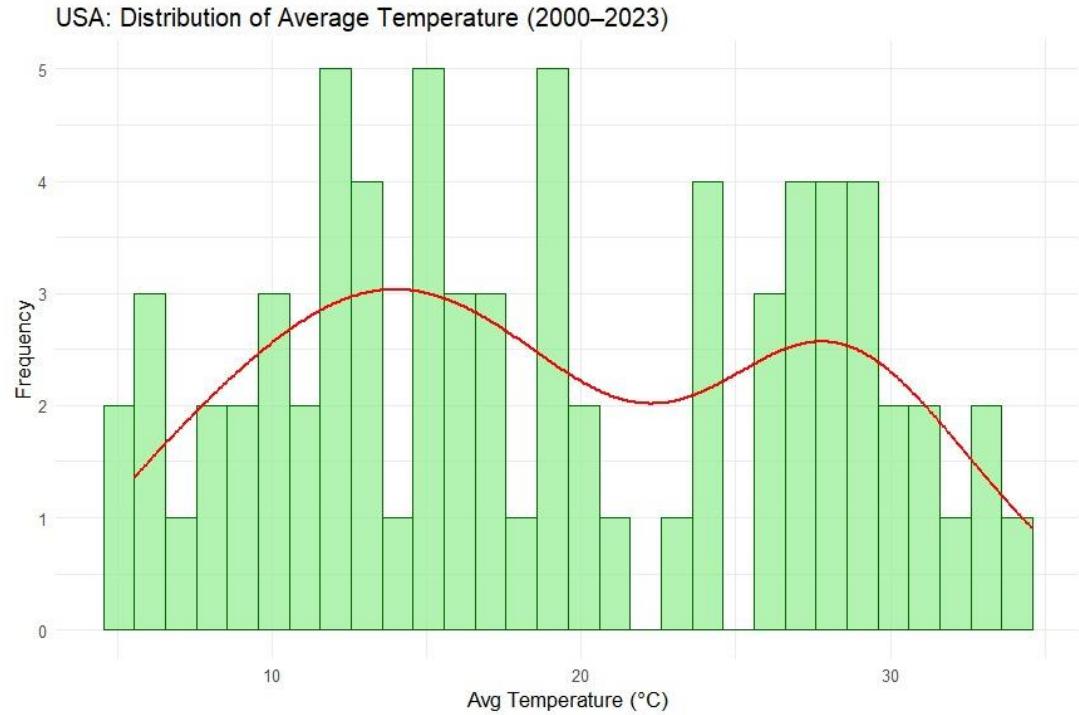
- **Dataset Title:** Global Environmental Trends (2000–2024)
- **Source:** Kaggle – temperature.csv
- **Frequency:** Annual (2000–2023)
- **Countries:** 15
- **Focus Country:** USA
- **Key Variable:** Average Temperature (°C)
- **Other Variables:** CO<sub>2</sub> Emissions, Sea Level Rise, Rainfall, Renewable Energy, Extreme Weather Events

# Average Temperature Over Time (2000-2023)



- Year-to-year temperature variability is high
- Peaks in 2011 and 2019 show extreme values
- Pattern is irregular and non-seasonal

# Distribution of Average Temperature Over Time (2000-2023)



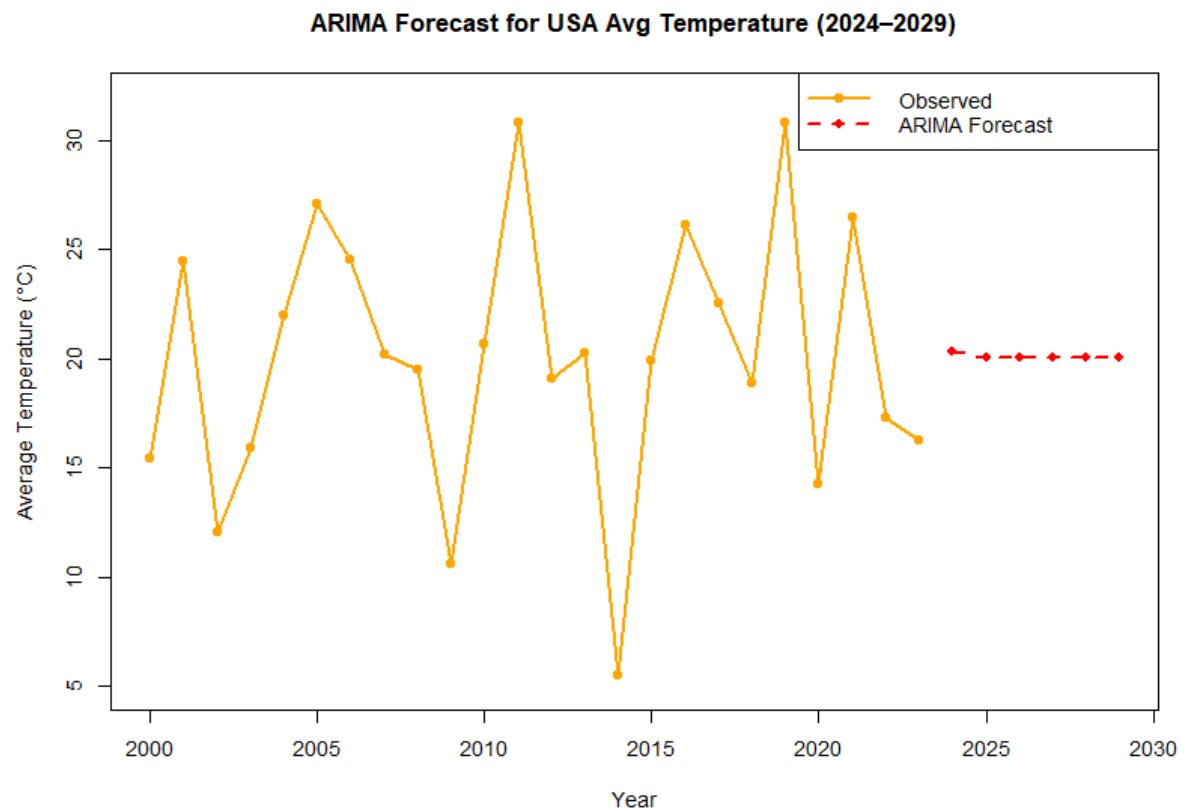
- Multimodal distribution (multiple peaks)
- Frequent temps around 10 -20°C and 25 - 30°C
- High variability supports ARIMA & ETS models

## Forecasting Models **(ARIMA & ETS)**

Forecasts from both models were plotted and compared:

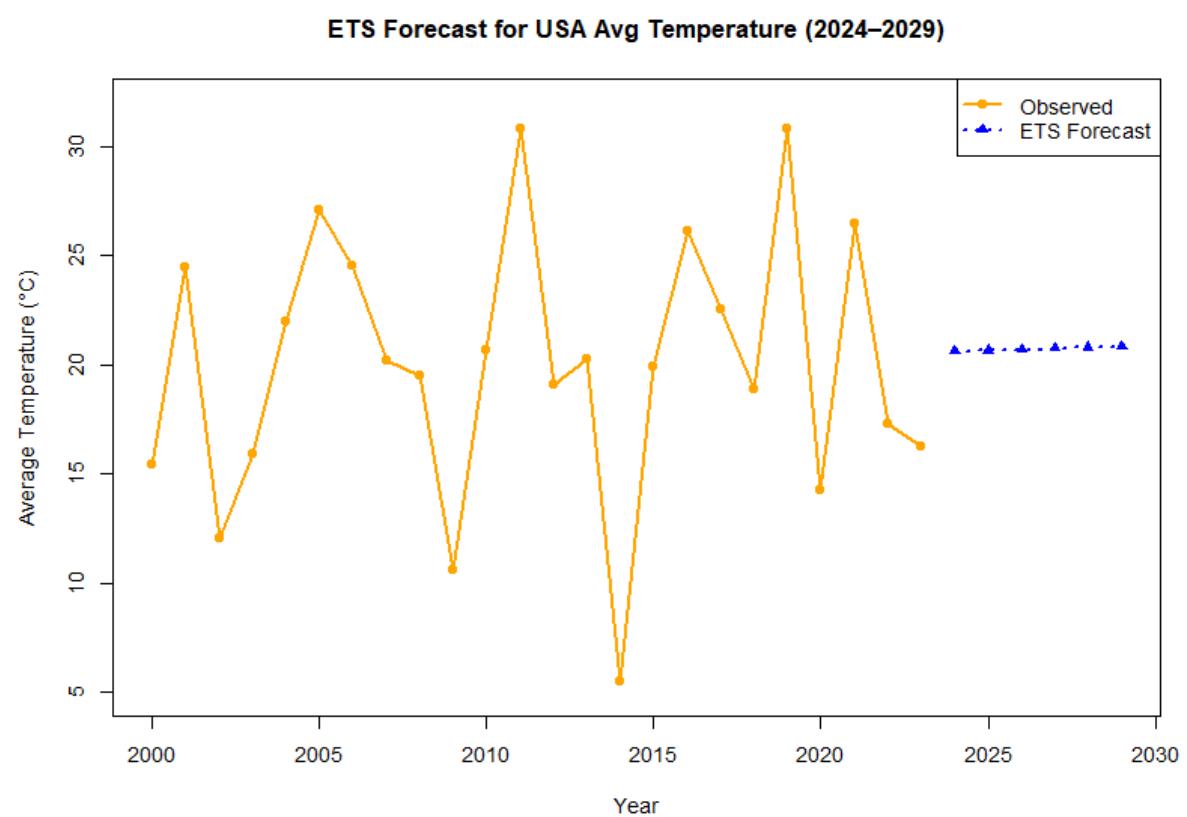
- ARIMA and ETS both show upward trends
- Visual comparison shows model agreement on rising temperature
- Forecasts labeled through 2029 with legends

# ARIMA FORECAST (2024 – 2029)



- ARIMA forecast predicts stable average temperatures around 20°C from 2024 to 2029.
- Reflects a flattening trend after years of historical fluctuations.
- Suggests no significant short-term rise or drop, based on past patterns.

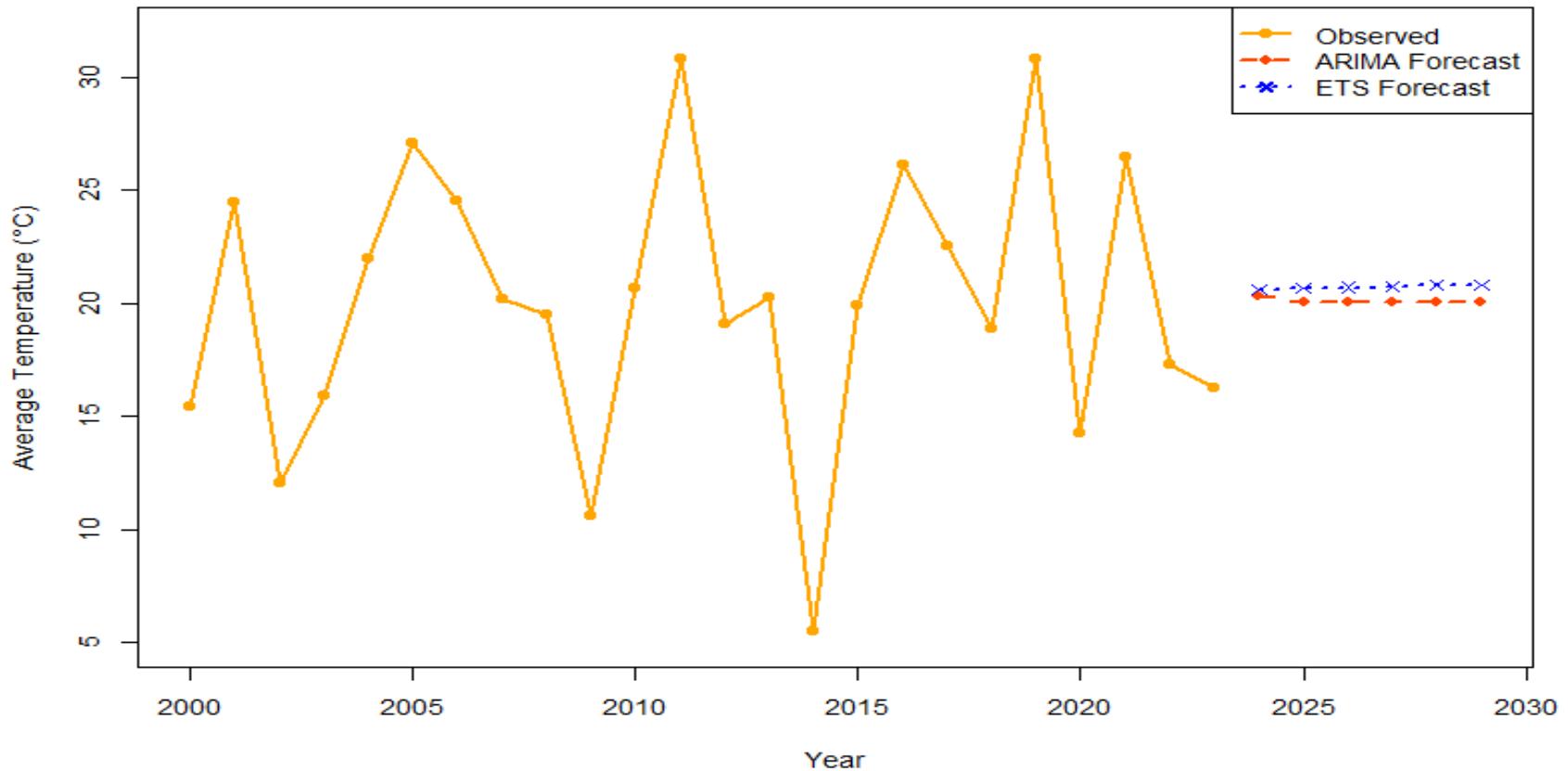
# ETS FORECAST (2024 – 2029)



- ETS model forecasts a steady upward trend from 2024 to 2029 around 21°C.
- Captures long-term patterns using error, trend, and seasonality components.
- Suggests moderate but consistent warming, aligned with environmental trends.

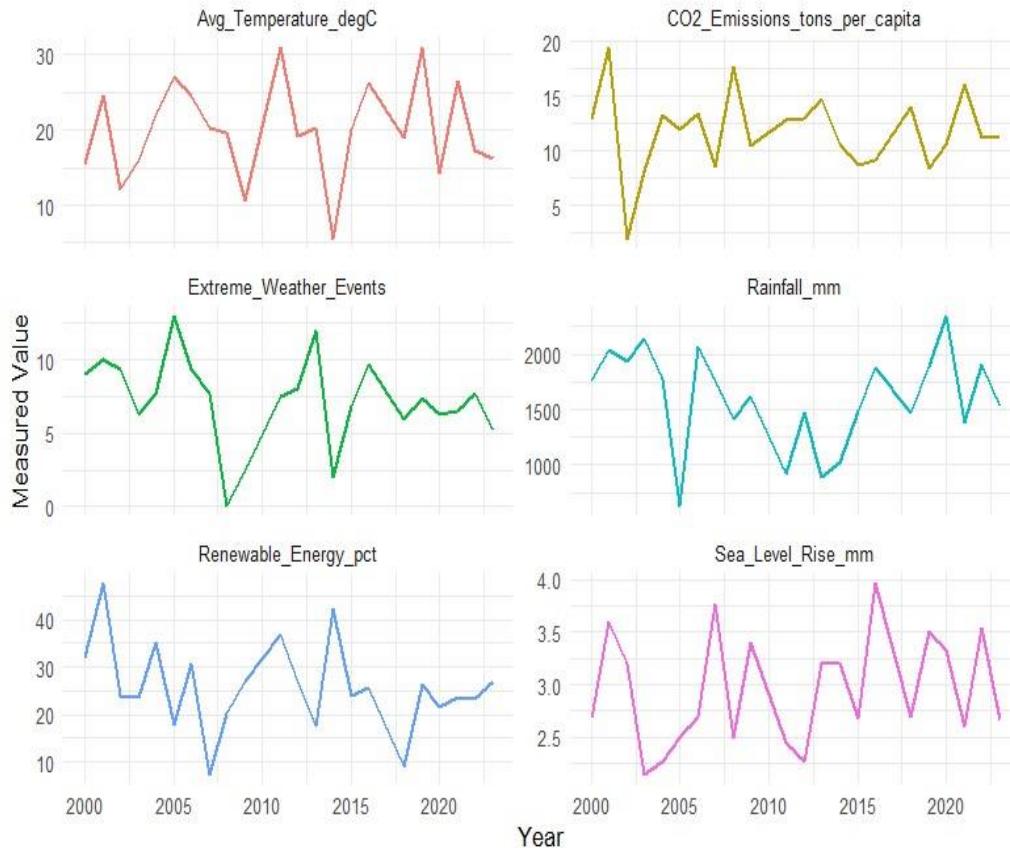
# ARIMA VS ETS

Forecasting USA Average Temperature: ARIMA vs ETS



# Environmental Indicators

Environmental Indicators in the USA (2000–2023)



- Key indicators like CO<sub>2</sub> emissions, rainfall, and sea level rise shown over time
  - CO<sub>2</sub> dropped in 2008, likely tied to the economic recession
  - Renewable energy shows no clear upward trend, while sea level rise is persistent
  - Helps understand factors that might influence temperature changes

### a. Regression Analysis (lm()):

- Predicts average temperature based on CO<sub>2</sub> emissions, rainfall, renewable energy %, population, and forest area
- summary(reg\_model) gives coefficients, p-values, and R<sup>2</sup> for interpretation

### b. Multivariate Visualization (ggpairs):

- Visualizes correlations and pairwise relationships between variables
- Helps detect multicollinearity or weak associations before modeling

Forecasting Models

(Regression &  
Multivariate Visualization )

# Regression Analysis

```
Call:
lm(formula = Avg_Temperature_degC ~ ., data = regression_data)

Residuals:
    Min      1Q  Median      3Q     Max 
-15.369 -6.232 -0.614  7.295 15.044 

Coefficients:
                                         Estimate Std. Error t value Pr(>|t|)    
(Intercept)                         2.444e+01  4.284e+00  5.705 2.87e-07  
CO2_Emissions_tons_per_capita     -4.925e-02  1.667e-01 -0.295 0.7685    
Rainfall_mm                          -2.784e-03  1.317e-03 -2.115 0.0382    
Renewable_Energy_pct                 5.675e-02  7.115e-02  0.798 0.4279    
Population                           1.642e-09  2.453e-09  0.670 0.5055    
Forest_Area_pct                     -7.012e-02  5.690e-02 -1.232 0.2222    

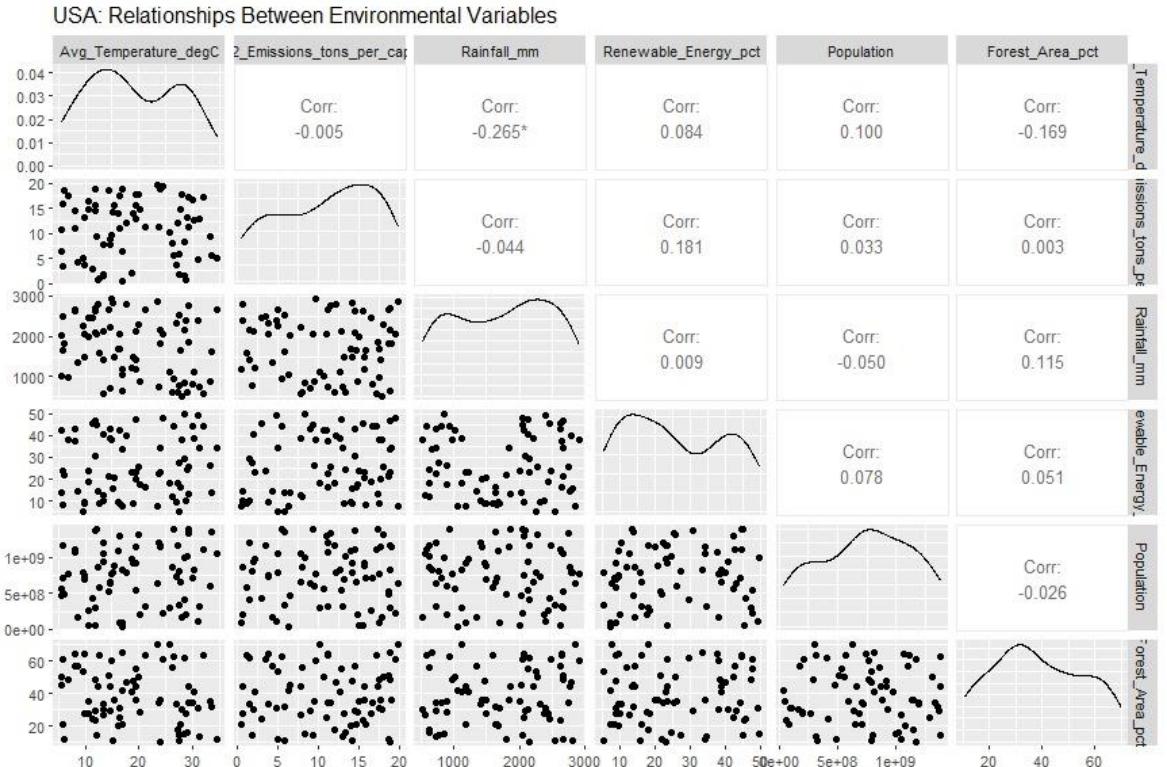
(Intercept)                         ***  
CO2_Emissions_tons_per_capita       *    
Rainfall_mm                           --- 
Renewable_Energy_pct                
Population                           
Forest_Area_pct                    

Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 8.178 on 67 degrees of freedom
Multiple R-squared:  0.1054,    Adjusted R-squared:  0.03863 
F-statistic: 1.579 on 5 and 67 DF,   p-value: 0.1781
```

- Rainfall was the only moderately significant predictor ( $p \approx 0.038$ )
- Other variables like CO<sub>2</sub>, renewable energy, and forest area were not statistically significant
- Model had low explanatory power (Adjusted R<sup>2</sup> ≈ 3.9%)

# Multivariate Regression & Correlation Analysis



- Rainfall shows a modest negative correlation with temperature (Corr: -0.265)
- Other variables (e.g., CO<sub>2</sub>, population, forest area) show weak or no significant correlation
- Suggests that temperature trends are influenced by multiple interacting factors, not just one variable

# Conclusion

- ✓ analyzed average temperature trends in the USA from 2000 to 2023 using time series data
- ✓ forecasted short-term trends with ARIMA and ETS models, both indicating temperature stability
- ✓ found that climate patterns are shaped by multiple environmental factors, not a single variable

Thank You