

## About the Data

1. **Area Code:** The numerical code of area column, type of area code is an integer.
2. **Area:** Countries and Territories (In 2019: 190 countries and 37 other territorial entities.), type of area is an object.
3. **Months Code:** The numerical code of months column, type of months code is an integer.
4. **Months:** Months, Seasons, Meteorological year, type of months is an object.
  - Months: 'January', 'February', 'March', 'April', 'May', 'June', 'July', 'August', 'September', 'October', 'November', 'December'
  - Seasons: 'Dec\x96Jan\x96Feb', 'Mar\x96Apr\x96May', 'Jun\x96Jul\x96Aug', 'Sep\x96Oct\x96Nov'
  - Year: 'Meteorological year'
5. **Element Code:** The numerical code of element column, type of element code is an integer.
6. **Element:** 'Temperature change', 'Standard Deviation', type of element is an object.
7. **Unit:** Celsius degrees °C, type of unit is an object.

## Questions

In the first step, I determined what I curious about climate change in light of the above-mentioned information, and I wrote these down:

1. What are the ten most countries that suffer from temperature change mostly in the last ten years?
2. What are the ten countries that suffer from temperature change at the very least in the last ten years?
3. Is there any significant difference between seasons?
4. What is the trend of temperature change in the world?

I will use python libraries within the Jupyter notebook environment for Investigation these questions. The main software libraries I'll be importing are Pandas, NumPy for data wrangling and Matplotlib, Plotly for data visualization.

```
In [20]: import pandas as pd
import numpy as np
import imageio
import pathlib
import matplotlib.pyplot as plt
import mapclassify as mc
import numpy as np
plt.style.use('ggplot')
#data visualization
import matplotlib as mpl
import plotly.graph_objects as go
import plotly.express as px
```

```
import plotly.offline as pyo
import plotly.graph_objs as go
#visualazation Libraries
import plotly.express as px
import plotly.offline as pyo
import plotly.graph_objs as go
pyo.init_notebook_mode()
```

```
In [21]: # read data sets
df = pd.read_csv("../input/temperature-change/Environment_Temperature_change_E_A
df.head()
```

Out[21]:

	Area Code	Area	Months Code	Months	Element Code	Element	Unit	Y1961	Y1962	Y1
0	2	Afghanistan	7001	January	7271	Temperature change	°C	0.777	0.062	2
1	2	Afghanistan	7001	January	6078	Standard Deviation	°C	1.950	1.950	1
2	2	Afghanistan	7002	February	7271	Temperature change	°C	-1.743	2.465	3
3	2	Afghanistan	7002	February	6078	Standard Deviation	°C	2.597	2.597	2
4	2	Afghanistan	7003	March	7271	Temperature change	°C	0.516	1.336	0

5 rows × 66 columns

```
In [22]: df.shape
```

Out[22]: (9656, 66)

```
In [23]: df.isnull().sum()
```

Out[23]:

Area Code	0
Area	0
Months Code	0
Months	0
Element Code	0
...	
Y2015	1295
Y2016	1308
Y2017	1290
Y2018	1307
Y2019	1291

Length: 66, dtype: int64

```
In [24]: country_df = pd.read_csv("../input/temperature-change/FAOSTAT_data_11-24-2020.cs
country_df.head()
```

Out[24]:

	Country Code	Country	M49 Code	ISO2 Code	ISO3 Code	Start Year	End Year
0	2	Afghanistan	4.0	AF	AFG	NaN	NaN
1	5100	Africa	2.0	NaN	X06	NaN	NaN
2	284	Åland Islands	248.0	NaN	ALA	NaN	NaN
3	3	Albania	8.0	AL	ALB	NaN	NaN
4	4	Algeria	12.0	DZ	DZA	NaN	NaN

```
In [25]: print("Months")
display(df.Months.unique())
```

Months

```
array(['January', 'February', 'March', 'April', 'May', 'June', 'July',
      'August', 'September', 'October', 'November', 'December',
      'Dec\x96Jan\x96Feb', 'Mar\x96Apr\x96May', 'Jun\x96Jul\x96Aug',
      'Sep\x96Oct\x96Nov', 'Meteorological year'], dtype=object)
```

```
In [26]: #1. Renaming
df.rename(columns = {'Area':'Country Name'},inplace = True)
```

```
In [27]: df.set_index('Months', inplace=True)
df.rename({'Dec\x96Jan\x96Feb': 'Winter', 'Mar\x96Apr\x96May': 'Spring', 'Jun\x96Jul\x96Aug': 'Summer', 'Sep\x96Oct\x96Nov': 'Autumn'}, inplace=True)
df.reset_index(inplace = True)
```

```
In [28]: #2. Filtering
df = df[df['Element'] == 'Temperature change']
```

```
In [29]: #2. Drop unwanted columns from df_countrycode
country_df.drop(['Country Code', 'M49 Code', 'ISO2 Code', 'Start Year', 'End Year'],
country_df.rename(columns = {'Country':'Country Name', 'ISO3 Code':'Country Code'})
```

```
In [30]: #3. Merging with df to df_country
df = pd.merge(df, country_df, how='outer', on='Country Name')
```

```
In [31]: #2. Drop some columns
df.drop(['Area Code', 'Months Code', 'Element Code', 'Element', 'Unit'],axis=1,inplace=True)
```

What are the ten most countries that suffer from temperature change mostly in the last ten years?

```
In [32]: #3.Channing dataframe organization
df = df.melt(id_vars=["Country Code", "Country Name", "Months",], var_name="year")
df["year"] = [i.split("Y")[-1] for i in df.year]

display(df.sample(5))
```

	Country Code	Country Name	Months	year	tem_change
137103	CHL	Chile	February	1989	1.152
85520	NIU	Niue	November	1978	-0.183
45943	LBR	Liberia	Spring	1970	0.319
93700	ECU	Ecuador	Winter	1980	0.409
181173	CIV	Côte d'Ivoire	December	1998	0.831

```
In [33]: df.dropna(inplace=True)
```

```
In [34]: df.isnull().sum()
```

```
Out[34]: Country Code    0
Country Name    0
Months          0
year            0
tem_change      0
dtype: int64
```

```
In [35]: # Convert the 'year' column to datetime format
df['year'] = pd.to_datetime(df['year'], format='%Y')

# Filter data for the last ten years
df_filtered = df[df['year'] >= pd.to_datetime('2013-01-01')]

# Calculate the average temperature change for each country
df_average_temp_change = df_filtered.groupby('Country Name')['tem_change'].mean()

# Sort the DataFrame by average temperature change in descending order
df_average_temp_change = df_average_temp_change.sort_values(ascending=False)

# Get the top 10 countries with the most temperature change
temp_countries = df_average_temp_change.reset_index()
temp_countries.head()
```

```
Out[35]:
```

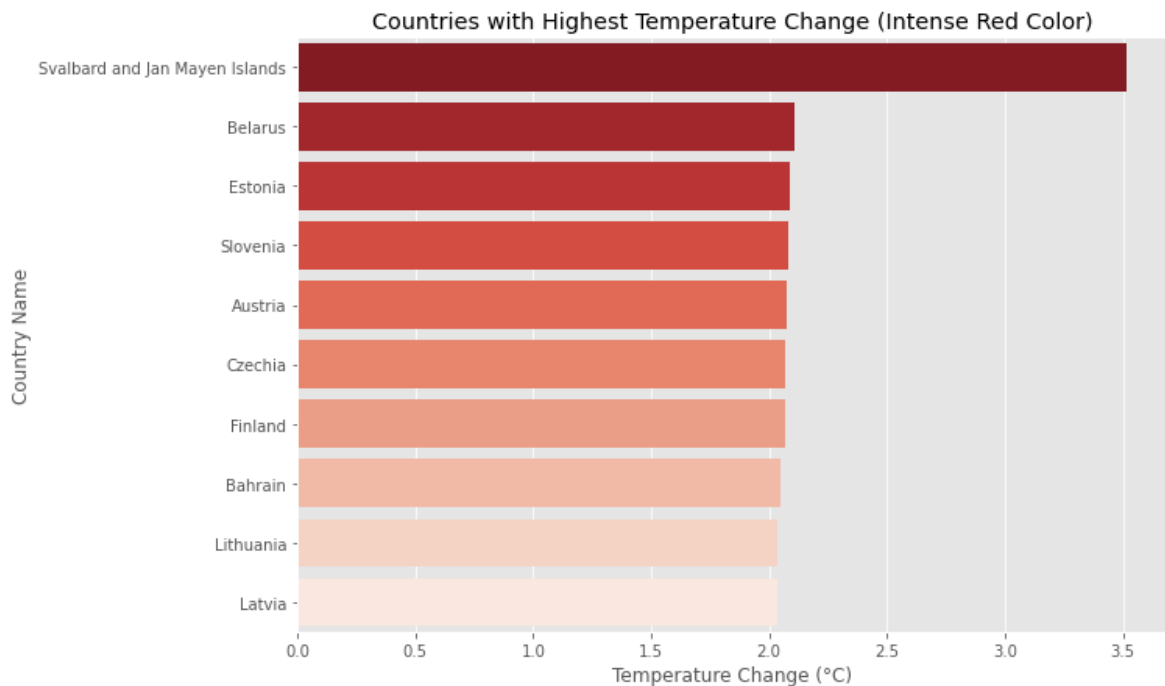
	Country Name	tem_change
0	Svalbard and Jan Mayen Islands	3.511697
1	Belarus	2.108445
2	Estonia	2.086681
3	Slovenia	2.080723
4	Austria	2.071319

```
In [39]: # Sort the DataFrame by temperature change in descending order
df_sorted = temp_countries.sort_values(by='tem_change', ascending=False)
# Separate into highest and lowest countries
highest_countries = df_sorted.head(10) # Adjust the number as needed
lowest_countries = df_sorted.tail(10) # Adjust the number as needed
```

## Highest Countries

**What are the ten most countries that suffer from temperature change mostly in the last ten years?**

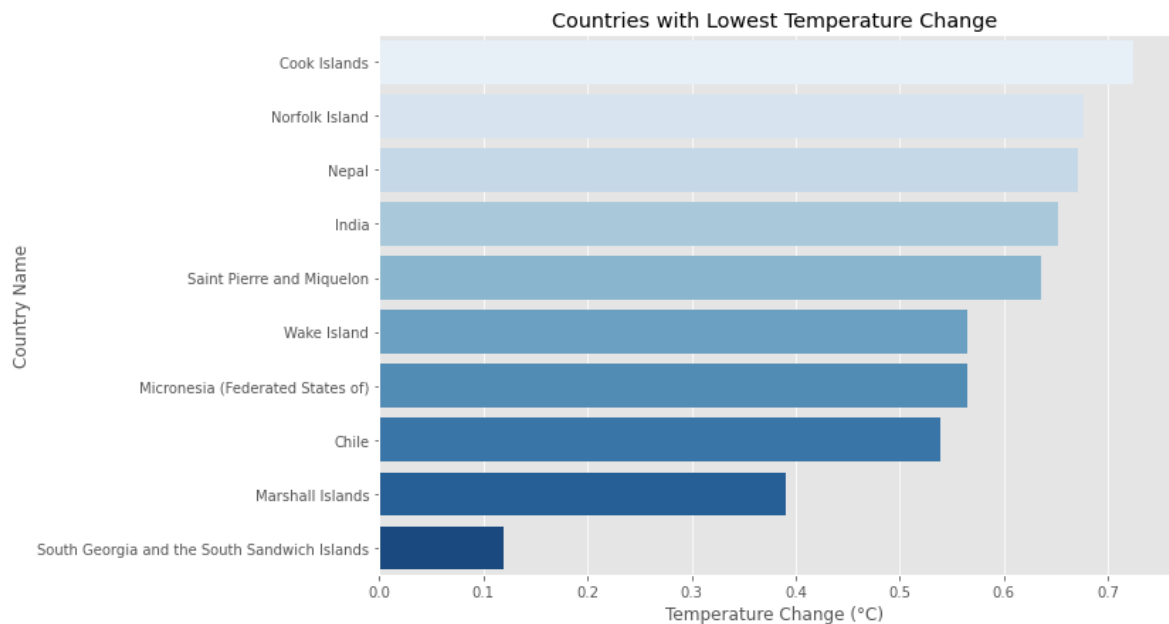
```
In [40]: # Bar plot for highest countries with more intense red color
import seaborn as sns
plt.figure(figsize=(10, 7))
sns.barplot(x=highest_countries['tem_change'], y=highest_countries['Country Name'])
plt.title('Countries with Highest Temperature Change (Intense Red Color)')
plt.xlabel('Temperature Change (°C)')
plt.ylabel('Country Name')
plt.show()
```



## Lowest Countries

**What are the ten countries that suffer from temperature change at the very least in the last ten years?**

```
In [44]: # Bar plot for lowest countries
plt.figure(figsize=(10, 7))
sns.barplot(x=lowest_countries['tem_change'], y=lowest_countries['Country Name'])
plt.title('Countries with Lowest Temperature Change')
plt.xlabel('Temperature Change (°C)')
plt.ylabel('Country Name')
plt.show()
```



## Highest Countries & Lowest Countries

```
In [78]: # Add a sign to the temperature change for positive/negative differentiation
highest_countries['tem_change_sign'] = highest_countries['tem_change']
lowest_countries['tem_change_sign'] = lowest_countries['tem_change'] * -1
# Concatenate the DataFrames
combined_df = pd.concat([highest_countries, lowest_countries])

# Create choropleth map for both highest and lowest countries with inverted colors
fig_combined = px.choropleth(
    combined_df,
    locations=combined_df['Country Name'],
    locationmode='country names',
    color=combined_df['tem_change_sign'],
    color_continuous_scale='RdBu_r', # Use 'RdBu_r' for inverted colors
    color_continuous_midpoint=0, # Set midpoint to 0 to have white color for 0
    title='Countries with Highest and Lowest Temperature Change (Inverted Colors)'
)

# Show the combined map
fig_combined.show()
```

## Is there any significant difference between seasons?

```
In [95]: from scipy.stats import f_oneway

# Perform ANOVA
anova_result = f_oneway(
    df['tem_change'][df['Months'] == 'Winter'],
    df['tem_change'][df['Months'] == 'Spring'],
    df['tem_change'][df['Months'] == 'Summer'],
    df['tem_change'][df['Months'] == 'Fall'],
    df['tem_change'][df['Months'] == 'Meteorological year']
)

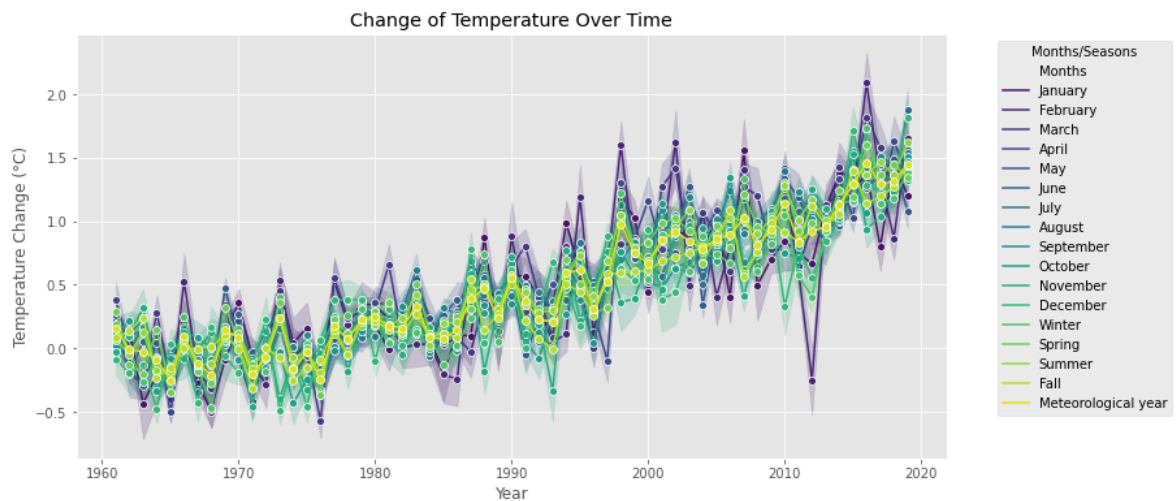
# Print ANOVA result
print("ANOVA p-value:", anova_result.pvalue)

# Check if p-value is significant (e.g.,  $p < 0.05$ )
if anova_result.pvalue < 0.05:
    print("There is a significant difference between seasons.")
else:
    print("No significant difference between seasons.")
```

ANOVA p-value: 4.5255782200100006e-27

There is a significant difference between seasons.

```
In [46]: plt.figure(figsize=(12, 6))
sns.lineplot(x='year', y='tem_change', hue='Months', data=df, marker='o', palette=
plt.title('Change of Temperature Over Time')
plt.xlabel('Year')
plt.ylabel('Temperature Change (°C)')
plt.legend(title='Months/Seasons', bbox_to_anchor=(1.05, 1), loc='upper left')
plt.show()
```

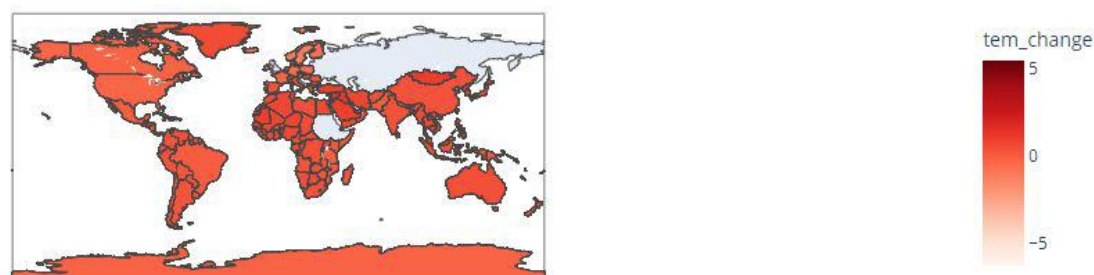


## What is the trend of temperature change in the world?

```
4]: import plotly.express as px
# Convert 'year' column to string
df['year'] = df['year'].dt.strftime('%Y')
# Example code for a choropleth map with red color scale
fig = px.choropleth(df,
                    locations='Country Code',
                    color='tem_change',
                    animation_frame='year',
                    title='Temperature Change Over the Years by Country',
                    color_continuous_scale='Reds') # Set color to red

fig.show()
```

Temperature Change Over the Years by Country





## References

<https://www.ipcc.ch/sr15/chapter/chapter-1/>

<http://www.fao.org/faostat/en/#data/ET>

<http://www.fao.org/faostat/en/#definitions>

<https://ocw.mit.edu>

<https://climate.nasa.gov/resources/global-warming-vs-climate-change/>

[<https://climate.nasa.gov/effects/>

<https://www.scientificamerican.com/article/in-just-10-years-warming-has-increased-the-odds-of-disasters/>

<https://www.deepdyve.com/lp/wiley/climate-change-impacts-on-wildlife-in-a-high-arctic-archipelago-zKjAbf0Y5t>

[https://unfccc.int/parties-](https://unfccc.int/parties-observers#:~:text=Annex%20I%20Parties%20include%20the,Central%20and%20Eastern%20E)

[observers#:~:text=Annex%20I%20Parties%20include%20the,Central%20and%20Eastern%20E](https://unfccc.int/parties-observers#:~:text=Annex%20I%20Parties%20include%20the,Central%20and%20Eastern%20E)

<https://www.nasa.gov/press-release/nasa-noaa-data-show-2016-warmest-year-on-record-globally>



In [ ]: