```
In [99]: # Import Libraries
                                    import pandas as pd
                                    import numpy as np
                                    import os
                                    import matplotlib.pyplot as plt
                                    %matplotlib inline
                                    import seaborn as sns
                                    from sklearn.metrics import mean_squared_error, mean_absolute_error, r2_score
                                    from sklearn.preprocessing import StandardScaler
                                    from sklearn.linear_model import LinearRegression
                                    import xgboost as xgb
                                    from xgboost import XGBRegressor
In [100]: # Import the dataset
                                    ghg = pd.read_excel("atmosphericemissionsghg.xlsx", index_col = 0, header = 3,
                                                                                                           sheet_name = 1, usecols = "C:AH", skiprows = [25])
In [101]: #Load the data
                                    ghg
Out[101]:
                                                                                                                                                               1990
                                                                                                                                                                                                                                                    1993
                                                                                                                                                                                                                                                                                                                                                                     1997
                                                                                                                                                                                           1991
                                                                                                                                                                                                                       1992
                                                                                                                                                                                                                                                                                1994
                                                                                                                                                                                                                                                                                                            1995
                                                                                                                                                                                                                                                                                                                                        1996
                                                                                                                                                                                                                                                                                                                                                                                                 1998
                                                                                                                                                                                                                                                                                                                                                                                                                             1999 ...
                                                                                                                                                                                                                                                                                                                                                                                                                                                                    2011
                                              Agriculture,
                                                                                                                                                       55231.9
                                                                                                                                                                                                                                                                                                   54770.8
                                                                                                                                                                                                                                                                                                                                55696.1
                                                                                                                                                                                                                                                                                                                                                                                        54808.8
                                                                                                                                                                                                                                                                                                                                                                                                                                                           46788.9
                                             forestry and fishing
                                                                                                                                                                                   54984.4
                                                                                                                                                                                                               54543.9
                                                                                                                                                                                                                                          53737.9
                                                                                                                                                                                                                                                                        54940.7
                                                                                                                                                                                                                                                                                                                                                            54825.4
                                                                                                                                                                                                                                                                                                                                                                                                                     54703.0 ...
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        46
                                                Mining and
                                                                                                                                                       48693.8
                                                                                                                                                                                  48707.1
                                                                                                                                                                                                               49331.3
                                                                                                                                                                                                                                          49142.4
                                                                                                                                                                                                                                                                       43788.7
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                                                                                                                                                                                                                                                                                                                                                            44970.7
                                                                                                                                                                                                                                                                                                                                                                                        43786.3
                                                                                                                                                                                                                                                                                                                                                                                                                      40140.2 ...
                                                                                                                                                                                                                                                                                                                                                                                                                                                           23694.3
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        21
                                                   quarrying
                                       Manufacturing
                                                                                                                                                    180563.3 181614.5 174343.2 168704.3 171407.7 169367.2 170747.2 169529.7 160536.1 144288.0
                                                                                                                                                                                                                                                                                                                                                                                                                                                           93409.9
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        89
                                                 Electricity,
                                                 gas, steam
                                           and air conditioning
                                                                                                                                                    216597.7 \quad 213315.8 \quad 201452.1 \quad 183993.2 \quad 179741.9 \quad 177199.8 \quad 177054.6 \quad 163758.4 \quad 169982.1 \quad 162476.6 \quad \dots \quad 163204.4 \quad 17719.8 \quad
                                                           supply
                                          Water supply;
                                                             waste
                                           management
                                                                                                                                                       67701.1 69200.7
                                                                                                                                                                                                               69402.1
                                                                                                                                                                                                                                          69615.1
                                                                                                                                                                                                                                                                        69851.2 70768.0
                                                                                                                                                                                                                                                                                                                            71303.9
                                                                                                                                                                                                                                                                                                                                                         70177.9 71206.3 66836.6 ...
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       29 🔻
```

## **Cleaning the Dataset**

In [102]:	02]: #Select the needed rows															
	<pre>ghg = ghg.iloc[:22]</pre>															
In [103]:	#Confirm that	the sele	ction wa	s done p	roperly											
	ghg															
Out[103]:		1990	1991	1992	1993	1994	1995	1996	1997	1998	1999		2011	2012	2013	2
	Agriculture, forestry and fishing	55231.9	54984.4	54543.9	53737.9	54940.7	54770.8	55696.1	54825.4	54808.8	54703.0		46788.9	46521.4	46318.8	482
	Mining and quarrying	48693.8	48707.1	49331.3	49142.4	43788.7	45511.6	45808.9	44970.7	43786.3	40140.2		23694.3	21941.5	20645.0	205
	Manufacturing	180563.3	181614.5	174343.2	168704.3	171407.7	169367.2	170747.2	169529.7	160536.1	144288.0		93409.9	89820.1	92374.4	918
	Electricity, gas, steam and air conditioning supply	216597.7	213315.8	201452.1	183993.2	179741.9	177199.8	177054.6	163758.4	169982.1	162476.6		163204.4	177660.1	168696.9	1475
	Water supply; sewerage, waste management and remediation	67701.1	69200.7	69402.1	69615.1	69851.2	70768.0	71303.9	70177.9	71206.3	66836.6		30447.3	29329.2	26867.1	251!
4	antivition															•

```
In [104]: # decribe the data for more information
                 ghg.describe()
    Out[104]:
                                  1991
                                                  1992
                                                                  1993
                                                                                  1994
                                                                                                 1995
                                                                                                                 1996
                                                                                                                                 1997
                                                                                                                                                1998
                                                                                                                                                                1999
                                                                                                                                                                                2000
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                  count
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                          76631.827273
                                          74855.759091
                                                          73224.054545
                                                                          72350.000000
                                                                                         71966.431818
                                                                                                         74369.209091
                                                                                                                         72938.309091
                                                                                                                                        73382.727273
                                                                                                                                                        70482.872727
                  mean
                          182267.883123
                                                                                                                                       173331.632007
                                                                                                                                                       166373.114290
                                                                                                                                                                      167322.445299
                    std
                                         177710.673396
                                                         173503.327192
                                                                        171440.887734
                                                                                        170332.422360
                                                                                                        175958.483413
                                                                                                                       172334.422468
                              45.600000
                                             46.600000
                                                             47.700000
                                                                            50.200000
                                                                                            51.800000
                                                                                                            50.500000
                                                                                                                           51.000000
                                                                                                                                           49.000000
                                                                                                                                                           50.500000
                                                                                                                                                                           60.700000
                    min
                                                           1889.200000
                                                                           1875.950000
                   25%
                            1996.950000
                                            1852.475000
                                                                                           1886.050000
                                                                                                          1935.400000
                                                                                                                          1768.200000
                                                                                                                                         1819.300000
                                                                                                                                                         1829.875000
                                                                                                                                                                         1841.600000
                   50%
                            7738.900000
                                            7960.550000
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                                                                           8025.400000
                                                                                           8039.900000
                                                                                                          8240.050000
                                                                                                                         7718.100000
                                                                                                                                         7498.950000
                                                                                                                                                         7360.000000
                                                                                                                                                                        6993.750000
                   75%
                           63643.075000
                                          64335.825000
                                                          65156.350000
                                                                          66123.575000
                                                                                         66768.700000
                                                                                                         67401.950000
                                                                                                                         66339.775000
                                                                                                                                        67106.925000
                                                                                                                                                        63803.200000
                                                                                                                                                                       61565.200000
                         842950.100000
                                         823413.400000
                                                         805464.700000
                                                                        795850.000000
                                                                                        791630.700000
                                                                                                        818061.300000
                                                                                                                       802321.400000
                                                                                                                                       807210.100000
                                                                                                                                                       775311.600000
                                                                                                                                                                      778470.000000
                 8 rows × 30 columns
                 4
    In [105]: #Transpose the data set for easy usage
                 ghg = ghg.T
                 ghg
    Out[105]:
                                                                                     Water
                                                                                                            Wholesale
                                                                                   supply;
                                                                  Electricity,
                                                                                                             and retail
                                                                                                                                                                        Professi
                                                                                sewerage
                         Agriculture,
                                        Mining
                                                                  gas, steam
                                                                                                          trade; repair
                                                                                                                        Transport
                                                                                                                                   Accommodation
                                                                                                                                                        Information
                                                                                                                                                                            scie
                                                                                    waste
                                                Manufacturing
                            forestry
                                           and
                                                                     and air
                                                                                            Construction
                                                                                                              of motor
                                                                                                                             and
                                                                                                                                          and food
                                                                                                                                                               and
                                                                              management
                                                                                                              vehicles
                                                                                                                                                                            tech
                         and fishing
                                     quarrying
                                                                conditioning
                                                                                                                          storage
                                                                                                                                          services
                                                                                                                                                    communication
                                                                                      and
                                                                      supply
                                                                                                                  and
                                                                                                                                                                            activ
                                                                               remediation
                                                                                                          motorcycles
                                                                                  activities
                  1990
                            55231.9
                                       48693.8
                                                                    216597.7
                                                                                   67701.1
                                                                                                  9441.6
                                                                                                               11724.4
                                                                                                                                                                               24
                                                      180563.3
                                                                                                                          65997.8
                                                                                                                                            2968.7
                                                                                                                                                             1103.6
                  1991
                            54984.4
                                       48707.1
                                                      181614.5
                                                                    213315.8
                                                                                   69200.7
                                                                                                  9409.6
                                                                                                               12113.6
                                                                                                                          66529.3
                                                                                                                                            3401.9
                                                                                                                                                             1181.4
                                                                                                                                                                               2
                            54543.9
                                       49331.3
                                                                    201452.1
                                                                                   69402.1
                                                                                                               11933.0
                                                                                                                                                             1149.6
                                                                                                                                                                               21
                  1992
                                                      174343.2
                                                                                                  9505.4
                                                                                                                          67599.8
                                                                                                                                            3124.6
                  1993
                            53737.9
                                       49142.4
                                                      168704.3
                                                                    183993.2
                                                                                   69615.1
                                                                                                  9622.9
                                                                                                               12179.4
                                                                                                                          68962.5
                                                                                                                                            3329.8
                                                                                                                                                             1199.8
                                                                                                                                                                               2!
                  1994
                            54940.7
                                        43788.7
                                                      171407.7
                                                                    179741.9
                                                                                   69851.2
                                                                                                 10047.5
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                  1995
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                                                                                                               12745.3
                                                                                                                          72797 N
                                                                                                                                            3422 በ
                                                                                                                                                             1278 6
4
    In [106]: # decribe the transposed data for more information
                 ghg.describe()
    Out[106]:
                                                                                       Water
                                                                                                              Wholesale
                                                                                     supply;
                                                                    Electricity.
                                                                                                               and retail
                                                                                                                                                                          Professio
                                                                                   sewerage,
                          Agriculture,
                                          Mining
                                                                    gas, steam
                                                                                                            trade; repair
                                                                                                                          Transport
                                                                                                                                    Accommodation
                                                                                                                                                          Information
                                                                                                                                                                              scient
                                                                                       waste
                              forestry
                                             and
                                                  Manufacturing
                                                                       and air
                                                                                              Construction
                                                                                                                of motor
                                                                                                                               and
                                                                                                                                            and food
                                                                                                                                                                 and
                                                                                management
                           and fishing
                                                                  conditioning
                                                                                                                vehicles
                                                                                                                            storage
                                                                                                                                                      communication
                                                                                                                                                                              techn
                                       quarrying
                                                                                                                                            services
                                                                                        and
                                                                        supply
                                                                                                                    and
                                                                                                                                                                              activi
                                                                                 remediation
                                                                                                            motorcycles
                                                                                    activities
                   count
                                 31.0
                                             31.0
                                                            31.0
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                                                                                                                                                31.0
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                  unique
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                                             31.0
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                                                                                                                                              2968.7
                                                                                                                                                               1103.6 ...
                                                                                                                                                                                 249
                     top
                              55231.9
                                          48693.8
                                                        180563.3
                                                                      216597.7
                                                                                     67701.1
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                                                                                                                 11724.4
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                     frea
                                   1.0
                                              1.0
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                                                                                         1.0
                                                                                                        1.0
                                                                                                                     1.0
                                                                                                                                1.0
                                                                                                                                                 1.0
                                                                                                                                                                  1.0 ...
                 4 rows × 22 columns
```

localhost:8888/notebooks/NAO DSI Excercise.ipynb

In [107]: # Search for missing values

Out[107]: 0

ghg.isnull().sum().sum()

```
In [108]: #rename the overly long_named columns

ghg.rename(columns={'Activities of households as employers; undifferentiated goods and services-producing activities of household

"Water supply; sewerage, waste management and remediation activities":"Water supply",

"Wholesale and retail trade; repair of motor vehicles and motorcycles":"Wholesale and retail trade",

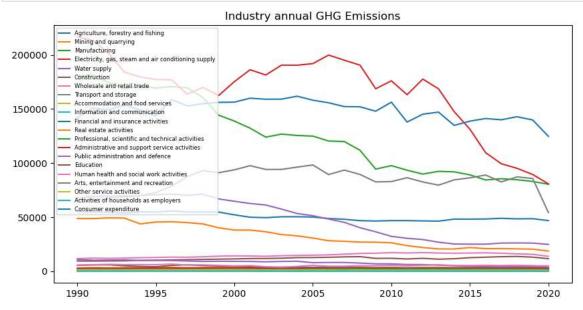
"Public administration and defence; compulsory social security":"Public administration and defence"}

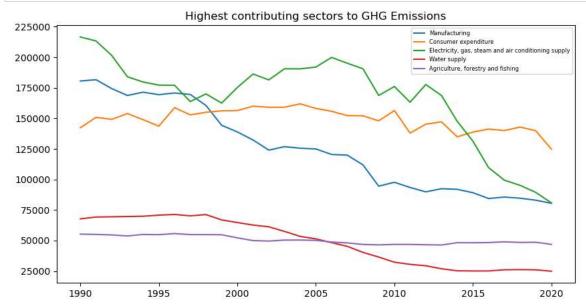
, inplace=True)
```

```
Exploring the Data
In [109]: #Check the dimension of the data
           ghg.shape
Out[109]: (31, 22)
In [110]:
            #Confirm the data types
           ghg.dtypes
Out[110]: Agriculture, forestry and fishing
                                                                          object
           Mining and quarrying
                                                                          object
                                                                          object
           Manufacturing
           Electricity, gas, steam and air conditioning supply
                                                                          object
           Water supply
                                                                          object
           Construction
                                                                          object
           Wholesale and retail trade
                                                                          object
           Transport and storage
                                                                          object
           Accommodation and food services
                                                                          object
           Information and communication
                                                                          object
           Financial and insurance activities
                                                                          object
           Real estate activities
                                                                          object
           Professional, scientific and technical activities
                                                                          object
           Administrative and support service activities
                                                                          object
           Public administration and defence
                                                                          object
           Education
                                                                          object
           Human health and social work activities
                                                                          object
           Arts, entertainment and recreation
                                                                          object
           Other service activities
                                                                          object
In [111]: #Convert the years to date time
           pd.to_datetime(ghg.index,format='%Y')
Out[111]: DatetimeIndex(['1990-01-01', '1991-01-01', '1992-01-01', '1993-01-01',
                             '1994-01-01',
                                            '1995-01-01',
                                                             '1996-01-01',
'2000-01-01',
                                                                             '1997-01-01',
                             '1998-01-01',
                                             '1999-01-01',
                                                                             '2001-01-01'
                                            '2003-01-01',
                                                            '2004-01-01',
                             '2002-01-01',
                                                                             '2005-01-01',
                                            '2007-01-01',
                             '2006-01-01',
                                                            '2008-01-01',
                                                                             '2009-01-01',
                                            '2011-01-01',
                                                            '2012-01-01',
                                                                             '2013-01-01',
                             '2010-01-01',
                             '2014-01-01',
                                            '2015-01-01', '2016-01-01', '2019-01-01', '2020-01-01'],
                                                                            '2017-01-01',
                             '2018-01-01',
                           dtype='datetime64[ns]', freq=None)
In [112]: #Select only data for the industry to create a graph
           industry = ghg.iloc[:, :-1]
           industry
Out[112]:
                                                        Electricity,
                                                                                                                                                       Prof
                                Mining and
                                                                                                                                                 Real
                  Agriculture,
                                                        gas, steam
                                                                                       Wholesale
                                                                                                  Transport Accommodation
                                                                                                                               Information
                                                                    Water
                      forestry
                                        Manufacturing
                                                           and air
                                                                          Construction
                                                                                        and retail
                                                                                                                  and food
                                                                                                                                                estate
                                                                                                       and
                                                                                                                                     and
                                                                   supply
                   and fishing
                              quarrying
                                                      conditioning
                                                                                            trade
                                                                                                    storage
                                                                                                                   services
                                                                                                                           communication
                                                                                                                                              activities
                                                           supply
            1990
                      55231.9
                                48693.8
                                             180563.3
                                                         216597.7 67701.1
                                                                                9441.6
                                                                                          11724.4
                                                                                                   65997.8
                                                                                                                    2968.7
                                                                                                                                   1103.6 ...
                                                                                                                                                 639.8
             1991
                      54984.4
                                48707.1
                                             181614.5
                                                         213315.8 69200.7
                                                                                9409.6
                                                                                          12113.6
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                                                                                                                    3401.9
                                                                                                                                   1181.4 ...
                                                                                                                                                 716.7
             1992
                      54543.9
                                49331.3
                                             174343.2
                                                         201452.1 69402.1
                                                                                9505.4
                                                                                          11933.0
                                                                                                   67599.8
                                                                                                                    3124.6
                                                                                                                                   1149.6 ...
                                                                                                                                                 687.7
             1993
                      53737.9
                                49142.4
                                             168704.3
                                                         183993.2 69615.1
                                                                                9622.9
                                                                                          12179.4
                                                                                                   68962.5
                                                                                                                    3329.8
                                                                                                                                   1199.8 ...
                                                                                                                                                 726.8
                               43788 7
                                                                                          12562.8
                                                                                                   69959 0
             1994
                      54940.7
                                             171407.7
                                                         179741.9 69851.2
                                                                               10047.5
                                                                                                                    3317.5
                                                                                                                                   1240.6 ...
                                                                                                                                                 745.7
                                                                                                                    3422.0
             1995
                      54770.8
                                45511.6
                                             169367.2
                                                         177199.8 70768.0
                                                                               10156.6
                                                                                          12745.3
                                                                                                   72797.0
                                                                                                                                   1278.6 ...
                                                                                                                                                 776.3
             1996
                      55696 1
                                45808 9
                                             170747 2
                                                         177054 6 71303 9
                                                                               10430.2
                                                                                          13070 4
                                                                                                   78479 7
                                                                                                                    3607.3
                                                                                                                                   1287 4
                                                                                                                                                 808 4
                                44970.7
                                                         163758.4 70177.9
                                                                               10681.6
                                                                                          12966.8
                                                                                                                                   1224.4 ...
                                                                                                                                                 757.0
             1997
                      54825.4
                                             169529.7
                                                                                                   87546.2
                                                                                                                    3220.1
```

## **Descriptive Analysis**

```
In [113]: #graph excluding total GHG emissions
industry.plot(figsize =(10,5), title = 'Industry annual GHG Emissions');
plt.legend(loc=2, prop={'size': 6})
plt.show()
```



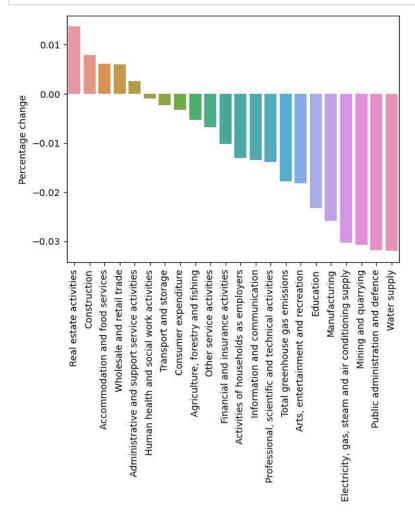


```
In [115]: #Check the mean of all sectors
          industry.mean(axis = 0).sort_values(ascending=False)
Out[115]: Electricity, gas, steam and air conditioning supply
                                                                  166285, 235484
                                                                  149123.248387
          Consumer expenditure
          Manufacturing
                                                                  125239.225806
          Transport and storage
                                                                   83626.438710
          Agriculture, forestry and fishing
                                                                   50471.325806
          Water supply
                                                                   48848,290323
          Mining and quarrying
                                                                   32786.170968
          Wholesale and retail trade
                                                                   14752.964516
          Construction
                                                                   11634.522581
          Public administration and defence
                                                                    7737.774194
          Human health and social work activities
                                                                    5382.509677
          Education
                                                                    3902.387097
          Accommodation and food services
                                                                    3445.919355
                                                                    3073.480645
          Administrative and support service activities
          Professional, scientific and technical activities
                                                                    2253,454839
          Arts, entertainment and recreation
                                                                    1307.222581
          Other service activities
                                                                    1092.703226
          Information and communication
                                                                    1075.222581
          Real estate activities
                                                                     860.977419
                                                                     308.983871
          Financial and insurance activities
          Activities of households as employers
                                                                      40.009677
          dtype: float64
In [116]: #Check the standard deviation of all sectors
          industry.std(axis = 0).sort_values(ascending=False)
Out[116]: Electricity, gas, steam and air conditioning supply
                                                                  36340.474088
                                                                  35065.150836
          Manufacturing
          Water supply
                                                                  18765.350080
          Transport and storage
                                                                  10907.974268
          Mining and quarrying
                                                                  10729.212472
          Consumer expenditure
                                                                   8831.072486
          Agriculture, forestry and fishing
                                                                   3332.167983
          Public administration and defence
                                                                   2182.689545
          Wholesale and retail trade
                                                                   1811.612945
          Construction
                                                                   1278.783360
          Education
                                                                   1103.939929
          Human health and social work activities
                                                                    641.622700
          Professional, scientific and technical activities
                                                                    328.578126
          Arts, entertainment and recreation
                                                                    286.676005
          Accommodation and food services
                                                                    224,622267
          Information and communication
                                                                    166.968603
          Administrative and support service activities
                                                                    156.824657
          Other service activities
                                                                    130.993429
          Real estate activities
                                                                     97,076474
          Financial and insurance activities
                                                                     37.111715
          Activities of households as employers
                                                                      9.546321
          dtype: float64
In [117]: #calculate the percentage change for all the sectors
          pct_change = ghg.pct_change()
          pct_change
Out[117]:
```

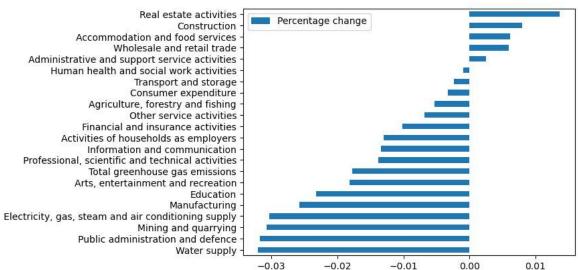
	Agriculture, forestry and fishing	Mining and quarrying	Manufacturing	Electricity, gas, steam and air conditioning supply	Water supply	Construction	Wholesale and retail trade	Transport and storage	Accommodation and food services	Information and communication	 Professional, scientific and technical activities
1990	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	 NaN
1991	-0.004481	0.000273	0.005822	-0.015152	0.022150	-0.003389	0.033196	0.008053	0.145922	0.070497	 0.083150
1992	-0.008011	0.012815	-0.040037	-0.055616	0.002910	0.010181	-0.014909	0.016091	-0.081513	-0.026917	 -0.034837
1993	-0.014777	-0.003829	-0.032344	-0.086665	0.003069	0.012361	0.020649	0.020158	0.065672	0.043667	 -0.039080
1994	0.022383	-0.108943	0.016024	-0.023106	0.003392	0.044124	0.031479	0.014450	-0.003694	0.034006	 0.022027
1995	-0.003092	0.039346	-0.011904	-0.014143	0.013125	0.010858	0.014527	0.040567	0.031500	0.030630	 0.030829
1996	0.016894	0.006532	0.008148	-0.000819	0.007573	0.026938	0.025507	0.078062	0.054150	0.006883	 0.008847
1997	-0.015633	-0.018298	-0.007130	-0.075097	-0.015792	0.024103	-0.007926	0.115527	-0.107338	-0.048936	 -0.068283

```
In [118]: #Get the overage average of all the sector percentage change
                                             avg_pct_change = pct_change.mean(axis=0).sort_values(ascending=False)
                                             avg_pct_change
Out[118]: Real estate activities
                                                                                                                                                                                                                                                                                            0.013655
                                            Construction
                                                                                                                                                                                                                                                                                            0.007932
                                             Accommodation and food services
                                                                                                                                                                                                                                                                                            0.006132
                                             Wholesale and retail trade
                                                                                                                                                                                                                                                                                            0.005988
                                             Administrative and support service activities
                                                                                                                                                                                                                                                                                            0.002522
                                             Human health and social work activities
                                                                                                                                                                                                                                                                                         -0.000915
                                             Transport and storage
                                                                                                                                                                                                                                                                                         -0.002385
                                                                                                                                                                                                                                                                                        -0.003299
                                             Consumer expenditure
                                             Agriculture, forestry and fishing
                                                                                                                                                                                                                                                                                         -0.005310
                                             Other service activities
                                                                                                                                                                                                                                                                                         -0.006801
                                             Financial and insurance activities
                                                                                                                                                                                                                                                                                         -0.010192
                                             Activities of households as employers
                                                                                                                                                                                                                                                                                        -0.013050
                                             Information and communication
                                                                                                                                                                                                                                                                                         -0.013422
                                             Professional, scientific and technical activities
                                                                                                                                                                                                                                                                                         -0.013818
                                             Total greenhouse gas emissions
                                                                                                                                                                                                                                                                                         -0.017810
                                             Arts, entertainment and recreation
                                                                                                                                                                                                                                                                                         -0.018184
                                             Education
                                                                                                                                                                                                                                                                                         -0.023214
                                            Manufacturing
                                                                                                                                                                                                                                                                                         -0.025791
                                             Electricity, gas, steam and air conditioning supply % \left( 1\right) =\left( 1\right) \left( 1\right) \left
                                                                                                                                                                                                                                                                                         -0.030301
In [119]: #convert to a dataframe
                                             avg_pct_change = pd.DataFrame(avg_pct_change)
                                             avg_pct_change.columns=["Percentage change"]
                                             avg_pct_change
Out[119]:
                                                                                                                                                                                                                        Percentage change
                                                                                                                                               Real estate activities
                                                                                                                                                                                                                                                          0.013655
                                                                                                                                                                       Construction
                                                                                                                                                                                                                                                          0.007932
                                                                                                  Accommodation and food services
                                                                                                                                                                                                                                                          0.006132
                                                                                                                              Wholesale and retail trade
                                                                                                                                                                                                                                                          0.005988
                                                                  Administrative and support service activities
                                                                                                                                                                                                                                                          0.002522
                                                                                  Human health and social work activities
                                                                                                                                                                                                                                                        -0.000915
                                                                                                                                         Transport and storage
                                                                                                                                                                                                                                                        -0.002385
                                                                                                                                        Consumer expenditure
                                                                                                                                                                                                                                                        -0.003299
                                                                                                            Agriculture, forestry and fishing
                                                                                                                                                                                                                                                         -0.005310
                                                                                                                                                                                                                                                        -0.006801
                                                                                                                                       Other service activities
                                                                                                      Financial and insurance activities
                                                                                                                                                                                                                                                        -0.010192
```

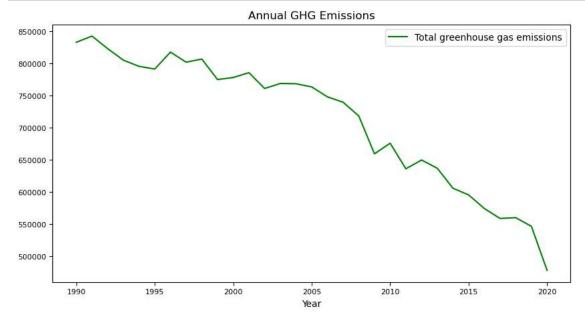
```
In [120]: #PLot the average percentage change using seaborn
sns.barplot(data = avg_pct_change, x= avg_pct_change.index, y= "Percentage change");
plt.xticks(rotation=90)
plt.show()
```







```
In [122]: #create a dataframe with the years and total GHG emissions
           df = pd.DataFrame(ghg["Total greenhouse gas emissions"], ghg.index)
           df.index.name = "Year'
Out[122]:
                  Total greenhouse gas emissions
            Year
            1990
                                     833354.6
            1991
                                     842950.1
            1992
                                     823413.4
                                     805464.7
            1993
                                     795850.0
            1994
            1995
                                     791630.7
                                     818061.3
            1996
            1997
                                     802321.4
                                     807210.1
            1998
            1999
                                     775311.6
```



```
In [124]: #Percentage change of total emissions over the years

df.pct_change().sort_values("Total greenhouse gas emissions", ascending = True)
```

## Out[124]: Total greenhouse gas emissions

Year	
2020	-0.125225
2009	-0.082107
2011	-0.058879
2014	-0.048859
1999	-0.039517
2016	-0.035505
2002	-0.031307
2008	-0.028850
2017	-0.026938
2019	-0.024122

```
In [125]: #Total GHG change from 1990 to 2020
            a = df.iloc[0]
            b= df.iloc[30]
            ((a-b) / a) * 100.0
Out[125]: Total greenhouse gas emissions
                                                     42.604325
            dtype: object
  In [ ]:
            Test/Train Split
In [126]: #Split dataset into train and test
            train = ghg.loc[ghg.index <= 2018]</pre>
            test = ghg.loc[ghg.index > 2018]
In [127]: #confirm the split was properly done
            train
Out[127]:
                                                           Electricity,
                                                                                                                                                       Professional.
                   Agriculture,
                                  Mining and
                                                                                             Wholesale
                                                                                                        Transport Accommodation
                                                           gas, steam
                                                                                                                                       Information
                                                                                                                                                          scientific
                                                                        Water
                       forestry
                                          Manufacturing
                                                               and air
                                                                               Construction
                                                                                              and retail
                                                                                                             and
                                                                                                                          and food
                                                                       supply
                    and fishing
                                                         conditioning
                                quarrying
                                                                                                 trade
                                                                                                          storage
                                                                                                                          services
                                                                                                                                   communication
                                                                                                                                                          technical
                                                                                                                                                          activities
                                                              supply
             Year
                                                                                                                                           1103.6 ...
             1990
                       55231.9
                                  48693.8
                                                180563.3
                                                             216597.7 67701.1
                                                                                     9441.6
                                                                                                11724.4
                                                                                                          65997.8
                                                                                                                            2968.7
                                                                                                                                                             2499.1
             1991
                                  48707.1
                                                             213315.8 69200.7
                                                                                     9409.6
                                                                                                12113.6
                                                                                                          66529.3
                                                                                                                            3401.9
                                                                                                                                            1181.4 ...
                                                                                                                                                             2706.9
                       54984.4
                                                181614.5
                                                                                                11933.0
             1992
                       54543.9
                                 49331.3
                                                174343.2
                                                             201452.1 69402.1
                                                                                     9505.4
                                                                                                          67599.8
                                                                                                                            3124.6
                                                                                                                                            1149.6 ...
                                                                                                                                                            2612.6
                       53737.9
                                                                                               12179.4
                                                                                                          68962.5
                                                                                                                            3329.8
             1993
                                 49142.4
                                                168704.3
                                                             183993.2 69615.1
                                                                                     9622.9
                                                                                                                                            1199.8 ...
                                                                                                                                                             2510.5
                       54940.7
                                  43788.7
                                                171407.7
                                                             179741.9 69851.2
                                                                                    10047.5
                                                                                               12562.8
                                                                                                          69959.0
                                                                                                                            3317.5
                                                                                                                                            1240.6 ...
                                                                                                                                                             2565.8
             1994
             1995
                       54770.8
                                  45511.6
                                                169367.2
                                                             177199.8 70768.0
                                                                                    10156.6
                                                                                               12745.3
                                                                                                          72797.0
                                                                                                                            3422.0
                                                                                                                                            1278.6 ...
                                                                                                                                                             2644.9
             1996
                       55696.1
                                  45808.9
                                                170747.2
                                                                                                13070.4
                                                                                                          78479.7
                                                             177054.6 71303.9
                                                                                     10430.2
                                                                                                                            3607.3
                                                                                                                                            1287.4 ...
                                                                                                                                                             2668.3
In [128]: #visiualise the test data
            test
Out[128]:
                                                           Electricity,
                                                                                                                                                       Professional,
                                                                                                                                                                    Adn
                                                           gas, steam
                   Agriculture,
                                  Mining and
                                                                                             Wholesale
                                                                                                        Transport
                                                                                                                  Accommodation
                                                                                                                                       Information
                                                                                                                                                          scientific
                                                                        Water
                       forestry
                                          Manufacturing
                                                              and air
                                                                               Construction
                                                                                             and retail
                                                                                                             and
                                                                                                                          and food
                                                                                                                                              and
                                                                                                                                                               and
                                                                       supply
                    and fishing
                                quarrying
                                                         conditioning
                                                                                                 trade
                                                                                                          storage
                                                                                                                                   communication
                                                                                                                                                          technical
                                                               supply
                                                                                                                                                          activities
             Year
             2019
                       48574.6
                                 20436.8
                                                82996.7
                                                              89421.3 26009.3
                                                                                    13036.3
                                                                                                15642.8
                                                                                                          85748.4
                                                                                                                            3663.3
                                                                                                                                            819.2
                                                                                                                                                             1823.3
             2020
                       46843.2
                                  18620.3
                                                80438.6
                                                              80770.4 24857.2
                                                                                    11614.6
                                                                                               13800.9
                                                                                                          54263.8
                                                                                                                            3172.5
                                                                                                                                            703.7 ...
                                                                                                                                                             1544.2
            2 rows × 22 columns
In [129]: #Convert to numbers
            train = train.to_numpy()
            test = test.to_numpy()
In [130]: #Setting our input and output arrays
            X = train[:, :-1]
            y = train[:, -1]
            X_test= test[:, :-1]
            y_test= test[:, -1]
```

```
In [131]: #view
          Х
Out[131]: array([[55231.9, 48693.8, 180563.3, 216597.7, 67701.1, 9441.6, 11724.4,
                   65997.8, 2968.7, 1103.6, 333, 639.8, 2499.1, 2681.5, 10854.7,
                   5480.6, 5743.7, 1641.3, 1120.9, 45.3, 142290.9],
                  [54984.4, 48707.1, 181614.5, 213315.8, 69200.7, 9409.6, 12113.6,
                   66529.3, 3401.9, 1181.4, 364.9, 716.7, 2706.9, 2824.1, 10174.6,
                   5809.0, 6068.2, 1760.3, 1220.1, 45.6, 150801.4],
                  [54543.9, 49331.3, 174343.2, 201452.1, 69402.1, 9505.4, 11933.0,
                   67599.8, 3124.6, 1149.6, 340.3, 687.7, 2612.6, 2781.0, 10303.2,
                  5921.0, 6415.7, 1599.1, 1160.7, 46.6, 149160.4],
[53737.9, 49142.4, 168704.3, 183993.2, 69615.1, 9622.9, 12179.4,
                   68962.5, 3329.8, 1199.8, 356.9, 726.8, 2510.5, 2872.7, 10512.6,
                   5030.7, 6099.7, 1682.1, 1217.4, 47.7, 153920.1],
                  [54940.7, 43788.7, 171407.7, 179741.9, 69851.2, 10047.5, 12562.8,
                   69959.0, 3317.5, 1240.6, 353.7, 745.7, 2565.8, 2965.2, 9876.2,
                   4503.7, 6174.6, 1646.0, 1218.2, 50.2, 148893.1],
                  [54770.8, 45511.6, 169367.2, 177199.8, 70768.0, 10156.6, 12745.3,
                   72797.0, 3422.0, 1278.6, 359.9, 776.3, 2644.9, 3022.0, 9989.2,
                   4205.3, 6090.6, 1633.1, 1243.9, 51.8, 143596.9],
                  [55696.1, 45808.9, 170747.2, 177054.6, 71303.9, 10430.2, 13070.4,
In [132]: #view
Out[132]: array([833354.6, 842950.1, 823413.4, 805464.7, 795850.0, 791630.7,
                  818061.3, 802321.4, 807210.1, 775311.6, 778470.0, 786023.2,
                  761414.9, 769198.0, 768757.0, 763847.3, 748397.6, 740014.3,
                  718664.6, 659657.4, 676190.7, 636377.6, 650028.2, 637271.5,
                  606135.1, 595689.2, 574539.0, 559062.3, 560295.1], dtype=object)
In [133]: #create and train the model
          model = xgb.XGBRegressor( n_estimators = 100, learning_rate=0.25)
          model.fit(X,y)
Out[133]: XGBRegressor(base_score=0.5, booster='gbtree', callbacks=None,
                        colsample_bylevel=1, colsample_bynode=1, colsample_bytree=1,
                        early_stopping_rounds=None, enable_categorical=False,
                        eval_metric=None, feature_types=None, gamma=0, gpu_id=-1,
                        grow_policy='depthwise', importance_type=None,
interaction_constraints='', learning_rate=0.25, max_bin=256,
                        max_cat_threshold=64, max_cat_to_onehot=4, max_delta_step=0,
                        max_depth=6, max_leaves=0, min_child_weight=1, missing=nan,
                        monotone_constraints='()', n_estimators=100, n_jobs=0,
                        num_parallel_tree=1, predictor='auto', random_state=0, ...)
In [134]: #make predictions using the model
          predictions = model.predict(X_test)
          predictions[0:]
Out[134]: array([560706.1 , 564884.44], dtype=float32)
In [135]: #view the target result
          y_test[0:]
Out[135]: array([546779.9, 478309.5], dtype=object)
In [136]: #accuracy of the model on the trained data
          predictions_train = model.predict(X)
          r2_score(y, predictions_train)
Out[136]: 0.999999999977015
In [137]: #mean squared error of the trained data
          mean_squared_error(y, predictions_train)
Out[137]: 0.017844827583818376
```

```
In [138]: #mean absolute error of the trained data
          mean_absolute_error(y, predictions_train)
Out[138]: 0.09482758620288223
In [139]: #accuracy of the model on the test data
          print (model.score(X_test, y_test))
          r2_score( y_test, predictions)
          -2.2802212522739875
Out[139]: -2.2802212522739875
In [140]: #mean squared error of the trained data
          mean_squared_error( y_test, predictions)
Out[140]: 3844579772.9397655
In [141]: | #mean absolute error of the trained data
          mean_absolute_error( y_test, predictions)
Out[141]: 50250.58124999999
In [142]: #Get the next years to predict and convert into a dataframe
          next_years = pd.date_range('2021', '2026', freq = 'Y')
          future_years = pd.DatetimeIndex(next_years).year
          future_df = pd.DataFrame(index = future_years)
          future_df
Out[142]:
           2021
           2022
           2023
           2024
           2025
In [143]: #Add the next years to the original data
          new_df = pd.concat([ghg,future_df])
In [144]: #Fill every column in the new data frame with the 0.2% decrease of the previous year value
          A = new_df.iloc[31]
          B = new_df.iloc[30]
          A.fillna(B*0.98, inplace= True)
          A = new_df.iloc[32]
          B = new_df.iloc[31]
          A.fillna(B*0.98, inplace= True)
          A = new_df.iloc[33]
          B = new_df.iloc[32]
          A.fillna(B*0.98, inplace= True)
          A = new_df.iloc[34]
          B = new_df.iloc[33]
          A.fillna(B*0.98, inplace= True)
          A = new_df.iloc[35]
          B = new_df.iloc[34]
          A.fillna(B*0.98, inplace= True)
```

In [145]: #round the dataframe to 2 decimal places
 new\_df.astype(float).round(2)

Out[145]:

		arrying	•	and air conditioning supply	Water supply	Construction	Wholesale and retail trade	Transport and storage	Accommodation and food services	Information and communication	 scientific and technical activities
<b>1990</b> 5523	231.90 480	3693.80	180563.30	216597.70	67701.10	9441.60	11724.40	65997.80	2968.70	1103.60	 2499.10
<b>1991</b> 5498	984.40 48	3707.10	181614.50	213315.80	69200.70	9409.60	12113.60	66529.30	3401.90	1181.40	 2706.90
<b>1992</b> 545	543.90 49	9331.30	174343.20	201452.10	69402.10	9505.40	11933.00	67599.80	3124.60	1149.60	 2612.60
<b>1993</b> 5373	737.90 49	9142.40	168704.30	183993.20	69615.10	9622.90	12179.40	68962.50	3329.80	1199.80	 2510.50
<b>1994</b> 549	940.70 43	3788.70	171407.70	179741.90	69851.20	10047.50	12562.80	69959.00	3317.50	1240.60	 2565.80
<b>1995</b> 547	770.80 45	5511.60	169367.20	177199.80	70768.00	10156.60	12745.30	72797.00	3422.00	1278.60	 2644.90
<b>1996</b> 5569	396.10 45a	5808.90	170747.20	177054.60	71303.90	10430.20	13070.40	78479.70	3607.30	1287.40	 2668.30
<b>1997</b> 5483	325.40 449	1970.70	169529.70	163758.40	70177.90	10681.60	12966.80	87546.20	3220.10	1224.40	 2486.10

In [146]: #select the new years data

test2 = new\_df.loc[new\_df.index >= 2021]
test2

Out[146]:

	Agriculture, forestry and fishing	Mining and quarrying	Manufacturing	Electricity, gas, steam and air conditioning supply	Water supply	Construction	Wholesale and retail trade	Transport and storage	Accommodation and food services	Information and communication	
2021	45906.336	18247.894	78829.828	79154.992	24360.056	11382.308	13524.882	53178.524	3109.05	689.626	
2022	44988.20928	17882.93612	77253.23144	77571.89216	23872.85488	11154.66184	13254.38436	52114.95352	3046.869	675.83348	
2023	44088.445094	17525.277398	75708.166811	76020.454317	23395.397782	10931.568603	12989.296673	51072.65445	2985.93162	662.31681	
2024	43206.676193	17174.77185	74194.003475	74500.04523	22927.489827	10712.937231	12729.510739	50051.201361	2926.212988	649.070474	
2025	42342.542669	16831.276413	72710.123405	73010.044326	22468.94003	10498.678487	12474.920525	49050.177333	2867.688728	636.089065	

5 rows × 22 columns

In [147]: #Convert to numbers and set input and output data

test2= test2.to\_numpy()
X\_test2= test2[:, :-1]
y\_test2= test2[:, -1]

```
In [148]: #view the input data
          X_test2
Out[148]: array([[45906.335999999996, 18247.894, 78829.828000000001, 79154.992,
                   24360.056, 11382.308, 13524.882, 53178.524000000005,
                   3109.049999999997, 689.626, 225.5959999999998,
                   872.003999999999, 1513.316, 2764.776, 3885.994, 2324.462,
                  4784.556, 860.048, 834.763999999999, 22.736, 122271.56199999999],
                  [44988.209279999995, 17882.93612, 77253.23144, 77571.89216,
                   23872.85488, 11154.66184, 13254.38436, 52114.95352,
                   3046.868999999997, 675.83348, 221.08407999999997,
                   854.563919999999, 1483.04968, 2709.4804799999997, 3808.27412,
                  2277.97276, 4688.864879999999, 842.84704, 818.0687199999999,
                  22.28128, 119826.13075999999],
                  [44088.4450944, 17525.2773976, 75708.1668112, 76020.4543168,
                   23395.3977824, 10931.568603200001, 12989.2966728, 51072.6544496,
                   2985.93162, 662.3168104, 216.66239839999997, 837.4726416,
                  1453.3886864, 2655.2908703999997, 3732.1086376, 2232.4133048,
                  4595.0875823999995, 825.9900992, 801.7073455999998, 21.8356544,
                   117429.60814479999],
                  [43206.676192512, 17174.771849647997, 74194.00347497601,
                   74500.04523046399, 22927.489826752, 10712.937231136,
                  12729.510739344, 50051.201360608, 2926.2129876, 649.070474192,
                  212.32915043199998, 820.723188768, 1424.320912672,
                   2602.185052992, 3657.4664648479998, 2187.765038704
                  4503.185830752, 809.4702972160001, 785.6731986879998,
                  21.398941311999998, 115081.01598190398],
                  [42342.54266866176, 16831.276412655036, 72710.1234054765,
                   73010.04432585472, 22468.94003021696, 10498.67848651328,
                  12474.92052455712, 49050.17733339584, 2867.688727848,
                  636.08906470816, 208.08256742335996, 804.30872499264,
                  1395.83449441856, 2550.1413519321595, 3584.31713555104,
                  2144.00973792992, 4413.12211413696, 793.28089127168
                   769.9597347142399, 20.970962485759998, 112779.3956622659]],
                dtype=object)
In [149]: #view the output data
          y_test2
Out[149]: array([468743.31, 459368.4438, 450181.074924, 441177.45342552,
                 432353.90435700957], dtype=object)
In [150]: #run the new data into the model
          GHG_forecast= model.predict(X_test2)
          GHG_forecast
Out[150]: array([564859.75, 564859.75, 564858.9, 564858.9, 564850.1],
                dtype=float32)
In [151]: #create a data frame of the forecast
          predictions_df = pd.DataFrame({'future_years': future_years, 'GHG_forecast': GHG_forecast},
                                         columns=['future_years', 'GHG_forecast'])
          predictions_df
Out[151]:
             future_years GHG_forecast
           0
                           564859.750
                   2021
           1
                   2022
                           564859.750
           2
                   2023
                           564858.875
                    2024
                           564858.875
                           564850.125
                    2025
```

```
In [152]: #Make the years the index
predictions_df = predictions_df.set_index("future_years")
predictions_df
```

Out[152]:

## gHG\_forecast future\_years 2021 564859.750 2022 564859.750 2023 564858.875 2024 564858.875 2025 564850.125

