## Dataset\_Building

December 29, 2022

```
[1]: import warnings
    warnings.filterwarnings('ignore')
[2]: import pandas as pd
     import numpy as np
[3]: monthly_df = pd.read_csv('Natural Gas Futures Historical Data Monthly.csv')
[4]: monthly_df
[4]:
               Date Price
                             Open
                                     High
                                             Low
                                                     Vol. Change %
         01/01/1995 1.354
                           1.760
                                    1.795
                                          1.250
                                                  332.65K -21.51%
                                    1.555 1.341
    1
         02/01/1995 1.483
                            1.345
                                                  270.04K
                                                             9.53%
    2
         03/01/1995 1.685
                            1.485
                                    1.725 1.417
                                                  273.23K
                                                            13.62%
    3
         04/01/1995 1.662 1.700
                                    1.745 1.585
                                                  224.41K
                                                            -1.36%
         05/01/1995 1.718 1.670
                                                  256.06K
                                    1.824
                                          1.635
                                                             3.37%
    . .
                     •••
                                     •••
                                           •••
                                                   •••
    331 08/01/2022 9.127 7.925
                                   10.005 7.559
                                                   86.29K
                                                            15.15%
                                                    1.30M -22.59%
    332 09/01/2022 7.065 9.194
                                    9.454 6.562
    333 10/01/2022 6.355 6.800
                                    7.188 4.750
                                                    2.01M -10.05%
    334 11/01/2022 6.930 6.270
                                    7.604 5.614
                                                    2.01M
                                                             9.05%
    335 12/01/2022 5.079 6.978
                                    7.210 4.779
                                                   87.38K -26.71%
    [336 rows x 7 columns]
[5]: monthly_df['Date'] = pd.to_datetime(monthly_df['Date'])
[6]: df = monthly_df[['Date', 'Price']]
    df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 336 entries, 0 to 335
    Data columns (total 2 columns):
         Column Non-Null Count Dtype
         ----
                -----
     0
         Date
                 336 non-null
                                datetime64[ns]
         Price
                 336 non-null
                                float64
```

```
memory usage: 5.4 KB
[7]: df = df.rename(columns={'Price':'Natural Gas Price'})
    df
[7]:
              Date Natural Gas Price
        1995-01-01
                                 1.354
    0
                                 1.483
    1
        1995-02-01
    2
                                 1.685
        1995-03-01
        1995-04-01
                                 1.662
    4
        1995-05-01
                                1.718
    . .
    331 2022-08-01
                                9.127
    332 2022-09-01
                                7.065
    333 2022-10-01
                                6.355
    334 2022-11-01
                                6.930
    335 2022-12-01
                                5.079
    [336 rows x 2 columns]
[8]: crude_oil = pd.read_csv('Crude Oil WTI Futures Historical Data Monthly.csv')
    crude_oil['Date'] = pd.to_datetime(crude_oil['Date'])
    crude_oil
[8]:
              Date Price
                                   High
                                                    Vol. Change %
                            Open
                                           Low
        1995-01-01 18.39
                           17.65
                                  18.85
                                         17.27
                                                791.63K
                                                           3.55%
    1
        1995-02-01 18.49 18.38
                                  18.98 18.13
                                                653.68K
                                                           0.54%
                                                           3.68%
        1995-03-01 19.17 18.52
                                  19.35 17.82
    2
                                                950.55K
        1995-04-01 20.38 19.12 20.82 18.90
    3
                                                760.45K
                                                           6.31%
    4
        1995-05-01 18.89 20.49 20.80
                                        18.45
                                                  1.00M
                                                          -7.31%
    331 2022-08-01 89.55 98.46
                                  98.65 85.73
                                                  6.61M
                                                          -9.20%
    332 2022-09-01 79.49 88.83 90.39
                                         76.25
                                                  5.81M -11.23%
    333 2022-10-01 86.53 81.02 93.64 80.87
                                                  5.33M
                                                           8.86%
    334 2022-11-01 80.56 86.17
                                  93.74 73.61
                                                  5.68M
                                                          -6.90%
    335 2022-12-01 79.81 80.56 83.33 70.11
                                                          -0.93%
                                                    NaN
    [336 rows x 7 columns]
[9]: crude oil df = crude oil[['Date', 'Price']]
     crude_oil_df = crude_oil_df.rename(columns={'Price':'Crude Oil Price'})
    crude_oil_df
[9]:
              Date Crude Oil Price
        1995-01-01
                              18.39
    0
    1
        1995-02-01
                              18.49
```

dtypes: datetime64[ns](1), float64(1)

```
20.38
      3
          1995-04-01
      4
          1995-05-01
                                18.89
      . .
      331 2022-08-01
                                89.55
      332 2022-09-01
                                79.49
      333 2022-10-01
                                86.53
      334 2022-11-01
                                80.56
      335 2022-12-01
                                79.81
      [336 rows x 2 columns]
[10]: new_data = df.merge(crude_oil_df,on='Date')
      new_data
[10]:
                Date Natural Gas Price Crude Oil Price
          1995-01-01
                                  1.354
                                                    18.39
      0
      1
          1995-02-01
                                   1.483
                                                    18.49
      2
          1995-03-01
                                  1.685
                                                    19.17
          1995-04-01
                                  1.662
                                                    20.38
          1995-05-01
                                  1.718
                                                    18.89
      . .
      331 2022-08-01
                                  9.127
                                                    89.55
      332 2022-09-01
                                  7.065
                                                    79.49
      333 2022-10-01
                                  6.355
                                                    86.53
      334 2022-11-01
                                  6.930
                                                    80.56
      335 2022-12-01
                                  5.079
                                                    79.81
      [336 rows x 3 columns]
[11]: dollar_index_df = pd.read_csv('US_Dollar_Index_Historical_Data.csv')
      dollar_index_df['Date'] = pd.to_datetime(dollar_index_df['Date'])
      dollar_index_df = dollar_index_df[['Date','Price']]
      dollar_index_df = dollar_index_df.rename(columns={'Price':'US Dollar Index'})
      dollar index df
[11]:
                Date US Dollar Index
          1995-01-01
                                87.99
      0
          1995-02-01
                                85.93
      1
      2
          1995-03-01
                                81.90
      3
          1995-04-01
                                81.80
      4
          1995-05-01
                                82.57
      331 2022-08-01
                                108.85
      332 2022-09-01
                                112.12
      333 2022-10-01
                               111.54
      334 2022-11-01
                               105.87
```

1995-03-01

19.17

```
335 2022-12-01
```

[336 rows x 2 columns]

```
[12]: | new_data = new_data.merge(dollar_index_df,on='Date')
      new_data
[12]:
                Date Natural Gas Price Crude Oil Price US Dollar Index
                                  1.354
                                                   18.39
                                                                     87.99
      0
         1995-01-01
      1
         1995-02-01
                                  1.483
                                                   18.49
                                                                     85.93
      2
                                                   19.17
                                                                     81.90
         1995-03-01
                                  1.685
      3
         1995-04-01
                                  1.662
                                                   20.38
                                                                     81.80
          1995-05-01
                                  1.718
                                                   18.89
                                                                     82.57
      331 2022-08-01
                                  9.127
                                                   89.55
                                                                    108.85
      332 2022-09-01
                                  7.065
                                                   79.49
                                                                   112.12
      333 2022-10-01
                                  6.355
                                                   86.53
                                                                   111.54
      334 2022-11-01
                                  6.930
                                                   80.56
                                                                    105.87
      335 2022-12-01
                                                   79.81
                                  5.079
                                                                    104.06
      [336 rows x 4 columns]
[13]: GDP = pd.read_csv('GDP.csv')
      GDP = GDP.tail(112)
      GDP = GDP.reset_index()
      GDP = GDP.drop(['index'],axis=1)
      GDP
「13]:
                             GDP
                 DATE
           1994-10-01
                        7455.288
      1
           1995-01-01
                        7522.289
      2
          1995-04-01
                        7580.997
      3
          1995-07-01
                        7683.125
      4
           1995-10-01
                        7772.586
      107 2021-07-01 23550.420
      108 2021-10-01 24349.121
      109 2022-01-01 24740.480
      110 2022-04-01 25248.476
      111 2022-07-01 25723.941
      [112 rows x 2 columns]
[14]: id = np.arange(0,112)
      df = pd.DataFrame(id, columns = ['id'])
```

```
[15]: GDP = pd.concat([df['id'],GDP['GDP'],], axis=1,ignore_index=False)
      GDP_yearly = GDP.append([GDP]*2,ignore_index=True).sort_values(by='id')
      GDP_yearly.reset_index(inplace= True)
      GDP_yearly = GDP_yearly.drop(['index'],axis=1)
[16]: GDP_yearly
[16]:
            id
                      GDP
      0
             0
                 7455.288
      1
             0
                 7455.288
      2
             0
                 7455.288
      3
             1
                 7522.289
      4
                 7522.289
      . .
      331
          110
                25248.476
      332
          110
                25248.476
      333
                25723.941
          111
      334
          111
                25723.941
      335
          111
                25723.941
      [336 rows x 2 columns]
[17]: final_data = pd.concat([new_data,GDP_yearly['GDP']], axis=1)
      final_data
[17]:
                      Natural Gas Price Crude Oil Price US Dollar Index
                                                                                    GDP
                Date
                                   1.354
                                                                      87.99
      0
          1995-01-01
                                                     18.39
                                                                               7455.288
                                   1.483
                                                     18.49
                                                                      85.93
                                                                               7455.288
      1
          1995-02-01
                                                                               7455.288
      2
          1995-03-01
                                   1.685
                                                     19.17
                                                                      81.90
      3
          1995-04-01
                                   1.662
                                                     20.38
                                                                      81.80
                                                                               7522.289
          1995-05-01
                                   1.718
                                                     18.89
                                                                      82.57
                                                                               7522,289
      331 2022-08-01
                                   9.127
                                                     89.55
                                                                     108.85
                                                                             25248.476
      332 2022-09-01
                                   7.065
                                                     79.49
                                                                     112.12
                                                                             25248.476
      333 2022-10-01
                                   6.355
                                                     86.53
                                                                     111.54
                                                                             25723.941
      334 2022-11-01
                                   6.930
                                                     80.56
                                                                     105.87
                                                                              25723.941
      335 2022-12-01
                                                     79.81
                                   5.079
                                                                     104.06 25723.941
      [336 rows x 5 columns]
[18]: df = pd.read_excel("Natural_Gas_Overview.xlsx")
      df = df.iloc[9:]
      df
[18]:
          U.S. Energy Information Administration
                                                                       Unnamed: 1 \
                                            Month
                                                   Natural Gas Gross Withdrawals
      10
                                              NaN
                                                             (Billion Cubic Feet)
```

11		-01 00:00:00	Not Available		
12 13		-01 00:00:00 -01 00:00:00	Not Available Not Available		
	1973-03	-01 00.00.00	NOT AVAITABLE		
603	2022-05	-01 00:00:00	3667.147		
604	2022-06	-01 00:00:00	3556.574		
605	2022-07	-01 00:00:00	3689.978		
606	2022-08	-01 00:00:00	3695.024		
607	2022-09	-01 00:00:00	3617.812		
0	Natural Gas Marketed Prod	Unnamed: 2	Unnamed: 3 \ NGPL Production		
9 10			.llion Cubic Feet)		
11	(BIIIIOI	1948	79		
12		1948	79 79		
13		1902	79 77		
603		 3295.871	 265.773		
604		3214.637	259.484		
605		3330.463	275.788		
606		3345.322	269.945		
607		3262.022	264.538		
	Unnamed	: 4	Unnamed: 5 \		
9	Natural Gas Production (D				
10	(Billion Cubic Fe	et) (Billi	on Cubic Feet)		
11	1	869	Not Available		
12	1	883	Not Available		
13	1	830	Not Available		
	2020		 F. C4		
603	3030.		5.61 4.034		
604	2955.		5.887		
605	3054.675 3075.377				
606 607	2997.		5.955 4.423		
007	2991.	404	4.425		
	Unnamed: 6	Unnamed: 7	Unnamed: 8 \		
9	Natural Gas Imports Na	tural Gas Exports	Natural Gas Net Imports		
10	-	llion Cubic Feet)	<del>-</del>		
11	92.694	5.808			
12	83.87	6.079	77.791		
13	91.581	4.021	87.56		
603	230.744	614.309			
604	220 726	EEV E40	_201 016		
	228.726	550.542			
605 606	257.052 235.709	556.495 554.813	-299.443		

607 233.781 525.904 -292.123

Unnamed: 10 \

Natural Gas Balancing Item

Unnamed: 9

Natural Gas Net Storage Withdrawals

```
10
                            (Billion Cubic Feet)
                                                         (Billion Cubic Feet)
                                   Not Available
                                                                 Not Available
      11
      12
                                   Not Available
                                                                 Not Available
                                   Not Available
                                                                 Not Available
      13
      603
                                        -403.136
                                                                        -4.164
      604
                                        -323.613
                                                                        11.171
      605
                                        -180.038
                                                                        15.668
      606
                                        -206.239
                                                                         4.941
      607
                                        -436.689
                                                                        33.811
                        Unnamed: 11
      9
           Natural Gas Consumption
      10
               (Billion Cubic Feet)
                                2348
      11
      12
                                2126
      13
                                2015
      . .
      603
                           2244.844
      604
                           2324.929
      605
                            2596.75
      606
                           2560.929
      607
                           2306.907
      [599 rows x 12 columns]
[19]: \# df = df.reset index()
      # df = df.drop(['index'],axis=1)
      # df
[20]: df = df.iloc[2:]
      df = df.drop(['Unnamed: 1', 'Unnamed: 2', 'Unnamed: 3', 'Unnamed: 5', 'Unnamed: __
       \hookrightarrow6', 'Unnamed: 7',
                     'Unnamed: 9', 'Unnamed: 10'], axis=1)
[21]: df = df.rename(columns={'U.S. Energy Information Administration':
       → 'Date', 'Unnamed: 4': 'Natural Gas Production',
                               'Unnamed: 11':'Natural Gas Consumption','Unnamed: 8':
       →'Net Imports'})
      df['Date'] = pd.to_datetime(df['Date'])
      df = df.tail(336)
      df = df.reset index()
      df = df.drop('index',axis=1)
```

df

[21]:		Date	Natural	Gas Production	Net Imports	Natural Gas Consumption	
	0	1994-10-01		1560.033	208.822	1514.35	
	1	1994-11-01		1603.862	206.435	1748.263	
	2	1994-12-01		1663.964	227.778	2119.285	
	3	1995-01-01		1598.615	239.7	2432.305	
	4	1995-02-01		1425.792	222.862	2230.289	
		•••		•••	•••	<b></b>	
	331	2022-05-01		3030.098	-383.564	2244.844	
	332	2022-06-01		2955.154	-321.816	2324.929	
	333	2022-07-01		3054.675	-299.443	2596.75	
	334	2022-08-01		3075.377	-319.104	2560.929	
	335	2022-09-01		2997.484	-292.123	2306.907	
	[336 rows x 4 columns]						
[22]:	fina	al_df = pd.o	concat([f	inal_data,df[['	Natural Gas	Production','Net⊔	
	$\hookrightarrow I$	mports','Na	tural Gas	s Consumption']	]], axis=1)		
	fina	al_df					
[22]:		Date	Natural	Gas Price Cru	ıde Oil Price	e US Dollar Index \	
	0	1995-01-01		1.354	18.39	87.99	
	1	1995-02-01		1.483	18.49	85.93	
	2	1995-03-01		1.685	19.17	81.90	
	3	1995-04-01		1.662	20.38	81.80	
	4	1995-05-01		1.718	18.89	82.57	
		•••		•••	***	•••	
	331	2022-08-01		9.127	89.55	108.85	
		2022-09-01		7.065	79.49		
		2022-10-01		6.355	86.53		
		2022-11-01		6.930	80.56		
	335	2022-12-01		5.079	79.81	104.06	
		GDP Natural Gas Production Net Imports Natural Gas Consumption					
	0	7455.288		1560.033	208.822	1514.35	
	1	7455.288		1603.862	206.435	1748.263	
	2	7455.288		1663.964	227.778	2119.285	
	3	7522.289		1598.615	239.7	2432.305	
	4	7522.289		1425.792	222.862	2230.289	
	••						
	331	25248.476		3030.098	-383.564	2244.844	
	332	25248.476		2955.154	-321.816	2324.929	
	333	25723.941		3054.675	-299.443	2596.75	
	334			3075.377	-319.104	2560.929	
	335	25723.941		2997.484	-292.123	2306.907	
	555	20.20.011		2007.101	202.120	2000.001	

```
[23]: final df[['Natural Gas Production','Net Imports','Natural Gas Consumption']] = [
       →final_df[
          ['Natural Gas Production','Net Imports','Natural Gas Consumption']].mul(0.
       →01)
[24]: final_df
[24]:
                Date Natural Gas Price Crude Oil Price US Dollar Index \
          1995-01-01
      0
                                  1.354
                                                    18.39
                                                                     87.99
          1995-02-01
                                  1.483
                                                    18.49
                                                                     85.93
      1
      2
         1995-03-01
                                  1.685
                                                    19.17
                                                                     81.90
      3
          1995-04-01
                                  1.662
                                                    20.38
                                                                     81.80
          1995-05-01
                                                                     82.57
      4
                                  1.718
                                                    18.89
      331 2022-08-01
                                  9.127
                                                    89.55
                                                                    108.85
      332 2022-09-01
                                  7.065
                                                    79.49
                                                                    112.12
      333 2022-10-01
                                  6.355
                                                    86.53
                                                                    111.54
      334 2022-11-01
                                  6.930
                                                    80.56
                                                                    105.87
      335 2022-12-01
                                  5.079
                                                    79.81
                                                                    104.06
                 GDP Natural Gas Production Net Imports Natural Gas Consumption
      0
            7455.288
                                   15.60033
                                                 2.08822
                                                                         15.1435
      1
            7455.288
                                   16.03862
                                                 2.06435
                                                                        17.48263
      2
           7455.288
                                   16.63964
                                                 2.27778
                                                                        21.19285
      3
            7522.289
                                   15.98615
                                                   2.397
                                                                        24.32305
      4
            7522.289
                                   14.25792
                                                 2.22862
                                                                        22.30289
      331 25248.476
                                   30.30098
                                                -3.83564
                                                                        22.44844
      332 25248.476
                                   29.55154
                                                -3.21816
                                                                        23.24929
      333 25723.941
                                   30.54675
                                                -2.99443
                                                                         25.9675
      334 25723.941
                                   30.75377
                                                -3.19104
                                                                        25.60929
      335 25723.941
                                   29.97484
                                                -2.92123
                                                                        23.06907
      [336 rows x 8 columns]
[25]: ng_df = pd.read_excel('NG_ENR_SUM_DCU_NUS_A.xls')
      ng_df = ng_df.iloc[2:,0:2]
      ng_df = ng_df.dropna()
      ng_df = ng_df.rename(columns={'Back to Contents':'Date',
                                     'Data 1: U.S. Natural Gas Reserves Summary as of
      →Dec. 31':'US total natural gas proved reserves (trillion cubic feet)'})
      ng_df['Date'] = pd.to_datetime(ng_df['Date'])
      ng_df = ng_df.tail(26)
      ng_df = ng_df.reset_index()
      ng_df = ng_df.drop('index',axis=1)
```

```
ng_df['US total natural gas proved reserves (trillion cubic feet)'] = ng_df['US_\_
      →total natural gas proved reserves (trillion cubic feet)'].mul(0.001)
     ng_df
[25]:
              Date US total natural gas proved reserves (trillion cubic feet)
     0 1995-06-30
                                                             173.476
     1 1996-06-30
                                                             175.147
     2 1997-06-30
                                                             175.721
     3 1998-06-30
                                                             172.443
     4 1999-06-30
                                                             176.159
     5 2000-06-30
                                                              186.51
     6 2001-06-30
                                                             191.743
     7 2002-06-30
                                                             195.561
     8 2003-06-30
                                                             197.145
     9 2004-06-30
                                                               201.2
     10 2005-06-30
                                                             213.308
     11 2006-06-30
                                                             220.416
     12 2007-06-30
                                                             247.789
     13 2008-06-30
                                                             255.035
     14 2009-06-30
                                                             283.879
     15 2010-06-30
                                                             317.647
     16 2011-06-30
                                                             348.809
     17 2012-06-30
                                                              322.67
     18 2013-06-30
                                                             353.994
     19 2014-06-30
                                                             388.841
     20 2015-06-30
                                                             324.303
     21 2016-06-30
                                                             341.133
     22 2017-06-30
                                                             464.292
     23 2018-06-30
                                                             504.501
     24 2019-06-30
                                                             494.911
     25 2020-06-30
                                                             473.285
[26]: df = pd.DataFrame(id, columns = ['id'])
     id = np.arange(0,26)
     ng_concat = pd.concat([df['id'],ng_df['US total natural gas proved reserves_
      ng_concat = ng_concat.append([ng_concat]*12,ignore_index=True).
      ⇔sort_values(by='id')
     ng_concat.reset_index(inplace= True)
     ng_concat = ng_concat.drop(['index'],axis=1)
     ng_concat = ng_concat.dropna()
     ng_concat
```

```
10
```

173.476

id US total natural gas proved reserves (trillion cubic feet)

[26]:

0

1

0

```
3
            0
                                                           173.476
      4
            0
                                                           173.476
      . .
           . .
      333
           25
                                                           473.285
      334
           25
                                                           473.285
      335
          25
                                                           473.285
      336
          25
                                                           473.285
                                                           473.285
      337
           25
      [338 rows x 2 columns]
[27]: final_dataframe = pd.concat([final_df,ng_concat['US total natural gas proved_
      →reserves (trillion cubic feet)']], axis=1)
      final_dataframe = final_dataframe.dropna()
      final_dataframe
[27]:
                Date Natural Gas Price Crude Oil Price US Dollar Index \
          1995-01-01
                                   1.354
                                                                       87.99
      0
                                                     18.39
                                                                       85.93
      1
          1995-02-01
                                   1.483
                                                     18.49
      2
          1995-03-01
                                   1.685
                                                     19.17
                                                                       81.90
      3
          1995-04-01
                                   1.662
                                                     20.38
                                                                       81.80
      4
          1995-05-01
                                   1.718
                                                     18.89
                                                                       82.57
      331 2022-08-01
                                   9.127
                                                     89.55
                                                                      108.85
      332 2022-09-01
                                   7.065
                                                     79.49
                                                                      112.12
                                                     86.53
      333 2022-10-01
                                   6.355
                                                                      111.54
      334 2022-11-01
                                   6.930
                                                     80.56
                                                                      105.87
      335 2022-12-01
                                   5.079
                                                     79.81
                                                                      104.06
                 GDP Natural Gas Production Net Imports Natural Gas Consumption \
      0
            7455.288
                                    15.60033
                                                  2.08822
                                                                           15.1435
      1
            7455.288
                                    16.03862
                                                  2.06435
                                                                          17.48263
      2
            7455.288
                                    16.63964
                                                  2.27778
                                                                          21.19285
      3
            7522.289
                                    15.98615
                                                    2.397
                                                                          24.32305
      4
            7522.289
                                    14.25792
                                                  2.22862
                                                                          22.30289
      331 25248.476
                                    30.30098
                                                 -3.83564
                                                                          22.44844
      332 25248.476
                                    29.55154
                                                 -3.21816
                                                                          23.24929
      333 25723.941
                                    30.54675
                                                 -2.99443
                                                                          25.9675
      334 25723.941
                                    30.75377
                                                 -3.19104
                                                                          25.60929
      335 25723.941
                                    29.97484
                                                 -2.92123
                                                                          23.06907
          US total natural gas proved reserves (trillion cubic feet)
      0
                                                       173.476
      1
                                                       173.476
      2
                                                       173.476
```

2

```
4
                                                      173.476
      331
                                                      473.285
      332
                                                      473.285
      333
                                                      473.285
      334
                                                      473.285
      335
                                                      473.285
      [336 rows x 9 columns]
[28]: final_dataframe['Natural Gas Production'] = pd.
      →to_numeric(final_dataframe['Natural Gas Production'])
      final_dataframe['Net Imports'] = pd.to_numeric(final_dataframe['Net Imports'])
      final_dataframe['US total natural gas proved reserves (trillion cubic feet)'] =__
       →pd.to_numeric(final_dataframe['US total natural gas proved reserves_
       [29]: final_dataframe.to_csv('Final_Data.csv',index=False)
[30]: data = pd.read_csv('Final_Data.csv')
[30]:
                 Date Natural Gas Price Crude Oil Price US Dollar Index \
           1995-01-01
                                   1.354
                                                     18.39
                                                                      87.99
      0
      1
           1995-02-01
                                   1.483
                                                     18.49
                                                                      85.93
                                                                      81.90
      2
           1995-03-01
                                   1.685
                                                     19.17
      3
           1995-04-01
                                                     20.38
                                                                      81.80
                                   1.662
      4
           1995-05-01
                                   1.718
                                                     18.89
                                                                      82.57
      331 2022-08-01
                                   9.127
                                                     89.55
                                                                     108.85
      332 2022-09-01
                                   7.065
                                                     79.49
                                                                     112.12
      333 2022-10-01
                                   6.355
                                                     86.53
                                                                     111.54
      334 2022-11-01
                                   6.930
                                                     80.56
                                                                     105.87
      335 2022-12-01
                                                     79.81
                                   5.079
                                                                     104.06
                                                            Natural Gas Consumption \
                 GDP
                      Natural Gas Production
                                             Net Imports
                                                   2.08822
      0
            7455.288
                                    15.60033
                                                                           15.14350
      1
            7455.288
                                    16.03862
                                                   2.06435
                                                                           17.48263
      2
            7455.288
                                    16.63964
                                                  2.27778
                                                                           21.19285
      3
            7522.289
                                    15.98615
                                                  2.39700
                                                                           24.32305
      4
            7522.289
                                    14.25792
                                                  2.22862
                                                                           22.30289
      331 25248.476
                                    30.30098
                                                  -3.83564
                                                                           22.44844
      332 25248.476
                                    29.55154
                                                 -3.21816
                                                                           23.24929
      333
          25723.941
                                    30.54675
                                                  -2.99443
                                                                           25.96750
      334 25723.941
                                    30.75377
                                                 -3.19104
                                                                           25.60929
```

	335	25723.941	29.97484	-2.92123	23.06907
		US total natural g	as proved reserves	(trillion cubic fo	eet)
	0			173.476	
	1			173.476	
	2			173.476	
	3			173.476	
	4			173.476	
				•••	
	331			473.285	
	332			473.285	
	333			473.285	
	334			473.285	
	335			473.285	
	[336	rows x 9 columns]			
[]:					
[]:					