# preprocessing

January 6, 2021

## 1 Preparar datos

```
[1]: import pandas as pd
import re
import numpy as np
from dataloader import DataLoader
```

#### 1.1 Datos no nulos

Como existen suficientes datos (existe al menos un dato para cada comunidad) se optó por eliminar las filas nulas. La eliminación se realizará en el momento de selección en la clase *DataLoader*, con el fin de mantener la máxima cantidad de datos.

```
[2]: df = pd.read_csv('energy-usage-2010.csv')
    df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 67051 entries, 0 to 67050
Data columns (total 73 columns):

#	Column	Non-Null Count	Dtype
0	COMMUNITY AREA NAME	67051 non-null	object
1	CENSUS BLOCK	66974 non-null	float64
2	BUILDING TYPE	66974 non-null	object
3	BUILDING_SUBTYPE	66974 non-null	object
4	KWH JANUARY 2010	66180 non-null	float64
5	KWH FEBRUARY 2010	66180 non-null	float64
6	KWH MARCH 2010	66180 non-null	float64
7	KWH APRIL 2010	66180 non-null	float64
8	KWH MAY 2010	66180 non-null	float64
9	KWH JUNE 2010	66180 non-null	float64
10	KWH JULY 2010	66180 non-null	float64
11	KWH AUGUST 2010	66180 non-null	float64
12	KWH SEPTEMBER 2010	66180 non-null	float64
13	KWH OCTOBER 2010	66180 non-null	float64
14	KWH NOVEMBER 2010	66180 non-null	float64

15	KWH DECEMBER 2010	66180	non-null	float64
16	TOTAL KWH	66180	non-null	float64
17	ELECTRICITY ACCOUNTS	66180	non-null	object
18	ZERO KWH ACCOUNTS	67051	non-null	int64
19	THERM JANUARY 2010	64821	non-null	float64
20	THERM FEBRUARY 2010	62819	non-null	float64
21	THERM MARCH 2010	65569	non-null	float64
22	THERM APRIL 2010	65476	non-null	float64
23	THERM MAY 2010	65194	non-null	float64
24	THERM JUNE 2010	65284	non-null	float64
25	THERM JULY 2010	65231	non-null	float64
26	THERM AUGUST 2010	65143	non-null	float64
27	THERM SEPTEMBER 2010	64769	non-null	float64
28	THERM OCTOBER 2010	65329	non-null	float64
29	THERM NOVEMBER 2010	65492	non-null	float64
30	THERM DECEMBER 2010	65507	non-null	float64
31	TOTAL THERMS	65755	non-null	float64
32	GAS ACCOUNTS	65755	non-null	object
33	KWH TOTAL SQFT	65901	non-null	-
34	THERMS TOTAL SQFT	65378	non-null	float64
35	KWH MEAN 2010	66180	non-null	float64
36	KWH STANDARD DEVIATION 2010	57095	non-null	float64
37	KWH MINIMUM 2010	66180	non-null	float64
38	KWH 1ST QUARTILE 2010	66180	non-null	float64
39	KWH 2ND QUARTILE 2010	66180	non-null	float64
40	KWH 3RD QUARTILE 2010	66180	non-null	float64
41	KWH MAXIMUM 2010	66180	non-null	float64
42	KWH SQFT MEAN 2010	65901	non-null	float64
43	KWH SQFT STANDARD DEVIATION 2010	51666	non-null	float64
44	KWH SQFT MINIMUM 2010		non-null	float64
45	KWH SQFT 1ST QUARTILE 2010	65901	non-null	float64
46	KWH SQFT 2ND QUARTILE 2010	65901	non-null	float64
47	KWH SQFT 3RD QUARTILE 2010	65901	non-null	float64
48	KWH SQFT MAXIMUM 2010	65901	non-null	float64
49	THERM MEAN 2010	65755	non-null	float64
50	THERM STANDARD DEVIATION 2010	56821	non-null	float64
51	THERM MINIMUM 2010	65755	non-null	float64
52	THERM 1ST QUARTILE 2010	65755	non-null	float64
53	THERM 2ND QUARTILE 2010	65755	non-null	float64
54	THERM 3RD QUARTILE 2010	65755	non-null	float64
55	THERM MAXIMUM 2010	65755	non-null	float64
56	THERMS SQFT MEAN 2010	65378	non-null	
57	THERMS SQFT STANDARD DEVIATION 2010	51367	non-null	
58	THERMS SQFT MINIMUM 2010		non-null	
59	THERMS SQFT 1ST QUARTILE 2010		non-null	
60	THERMS SQFT 2ND QUARTILE 2010		non-null	
61	THERMS SQFT 3RD QUARTILE 2010		non-null	
62	THERMS SQFT MAXIMUM 2010		non-null	
	•			

```
TOTAL POPULATION
                                               67037 non-null float64
     64
         TOTAL UNITS
                                               67037 non-null float64
     65
         AVERAGE STORIES
                                               67051 non-null float64
         AVERAGE BUILDING AGE
                                               67051 non-null float64
     66
     67
         AVERAGE HOUSESIZE
                                               67037 non-null float64
         OCCUPIED UNITS
                                               67037 non-null float64
     68
     69
         OCCUPIED UNITS PERCENTAGE
                                               64606 non-null float64
     70
         RENTER-OCCUPIED HOUSING UNITS
                                               67037 non-null float64
     71 RENTER-OCCUPIED HOUSING PERCENTAGE
                                               64433 non-null float64
         OCCUPIED HOUSING UNITS
                                               67037 non-null float64
    dtypes: float64(67), int64(1), object(5)
    memory usage: 37.3+ MB
[3]: df.describe()
            CENSUS BLOCK
                          KWH JANUARY 2010
                                            KWH FEBRUARY 2010
                                                                KWH MARCH 2010
            6.697400e+04
                              6.618000e+04
                                                  6.618000e+04
                                                                  6.618000e+04
     count
    mean
            1.703140e+14
                              1.758159e+04
                                                  1.737651e+04
                                                                  1.624212e+04
     std
            2.776392e+09
                              3.482508e+05
                                                  3.351910e+05
                                                                  3.164713e+05
                                                  0.000000e+00
                                                                  0.000000e+00
    min
            1.703101e+14
                              0.000000e+00
    25%
            1.703116e+14
                              1.370000e+03
                                                  1.613000e+03
                                                                  1.586000e+03
     50%
            1.703133e+14
                              3.481500e+03
                                                  3.814000e+03
                                                                  3.681500e+03
     75%
            1.703167e+14
                                                                  7.059000e+03
                              7.157000e+03
                                                  7.410250e+03
     max
            1.703198e+14
                              5.298534e+07
                                                  4.787976e+07
                                                                  4.413646e+07
            KWH APRIL 2010 KWH MAY 2010 KWH JUNE 2010 KWH JULY 2010
              6.618000e+04
                            6.618000e+04
                                           6.618000e+04
                                                           6.618000e+04
     count
              1.595696e+04
                            1.906623e+04
                                           2.300485e+04
                                                           2.482891e+04
    mean
     std
              3.118232e+05
                            3.634429e+05
                                           3.988582e+05
                                                           4.135955e+05
              0.000000e+00
                            0.000000e+00
                                           0.000000e+00
                                                           0.000000e+00
    min
     25%
              1.579000e+03
                            1.957000e+03
                                            2.700000e+03
                                                           3.203000e+03
     50%
              3.646000e+03
                            4.528000e+03
                                           6.295000e+03
                                                           7.389000e+03
     75%
              7.010000e+03
                            8.943500e+03
                                            1.282850e+04
                                                           1.465750e+04
    max
              4.222055e+07
                            4.861925e+07
                                           5.256908e+07
                                                           5.513983e+07
            KWH AUGUST 2010
                             KWH SEPTEMBER 2010
                                                     TOTAL POPULATION
                                   6.618000e+04
     count
               6.618000e+04
                                                         67037.000000
    mean
               2.267526e+04
                                   1.856410e+04
                                                           105.180169
     std
               3.940989e+05
                                   3.486212e+05
                                                           801.339175
               0.000000e+00
                                   0.000000e+00
    min
                                                             0.000000
     25%
               2.837750e+03
                                   2.027000e+03
                                                            37.000000
     50%
               6.413500e+03
                                   4.573000e+03
                                                            64.000000
     75%
               1.229800e+04
                                   8.634000e+03
                                                           105.000000
               5.158912e+07
                                   4.450386e+07
                                                         67388.000000
    max
             TOTAL UNITS
                          AVERAGE STORIES
                                           AVERAGE BUILDING AGE AVERAGE HOUSESIZE
```

[3]:

count

67037.000000

67051.000000

67037.000000

67051.000000

```
48.375897
                                  1.887592
                                                        71.593006
                                                                             3.454721
    mean
              426.941305
                                  1.957215
                                                        34.168384
                                                                            26.146208
    std
    min
                0.000000
                                  1.000000
                                                         0.00000
                                                                             0.000000
    25%
               15.000000
                                  1.140000
                                                        53.000000
                                                                             2.150000
    50%
               25.000000
                                  1.750000
                                                        80.000000
                                                                             2.700000
    75%
               42.00000
                                  2.000000
                                                        96.500000
                                                                             3.320000
            51372.000000
                                                       158.000000
                                                                          2061.920000
    max
                                110.000000
            OCCUPIED UNITS
                             OCCUPIED UNITS PERCENTAGE
              67037.000000
                                           64606.000000
     count
    mean
                 42.347495
                                               0.880365
    std
                371.024953
                                               0.130937
    min
                  0.000000
                                               0.000000
    25%
                 13.000000
                                               0.833200
    50%
                 22.000000
                                               0.914600
    75%
                 37.000000
                                               0.967700
              43222.000000
                                               1.000000
    max
            RENTER-OCCUPIED HOUSING UNITS
                                            RENTER-OCCUPIED HOUSING PERCENTAGE
                              67037.000000
                                                                    64433.000000
     count
                                 25.438952
    mean
                                                                        0.511679
    std
                                251.193571
                                                                        0.288431
    min
                                  0.00000
                                                                        0.000000
    25%
                                  3.000000
                                                                        0.286000
    50%
                                                                        0.537900
                                 11.000000
    75%
                                 23.000000
                                                                        0.733000
                              28335.000000
    max
                                                                        1.000000
            OCCUPIED HOUSING UNITS
                      67037.000000
     count
                          42.347495
    mean
    std
                         371.024953
                           0.00000
    min
    25%
                          13.000000
     50%
                          22.000000
    75%
                          37.000000
                      43222.000000
    max
     [8 rows x 68 columns]
[4]: missing_energy = df[DataLoader(df).energy_cols].isna().sum()
     missing_energy_per = missing_energy * 100 / len(df)
    missing_energy_per, missing_energy_per.mean()
[4]: (KWH JANUARY 2010
                             1.299011
```

1.299011

1.299011

KWH FEBRUARY 2010

KWH MARCH 2010

```
KWH APRIL 2010
                       1.299011
KWH MAY 2010
                       1.299011
KWH JUNE 2010
                       1.299011
KWH JULY 2010
                       1.299011
KWH AUGUST 2010
                       1.299011
KWH SEPTEMBER 2010
                       1.299011
KWH OCTOBER 2010
                       1.299011
KWH NOVEMBER 2010
                       1.299011
KWH DECEMBER 2010
                       1.299011
dtype: float64,
1.2990112004295238)
```

```
[5]: missing_gas = df[DataLoader(df).gas_cols].isna().sum()
missing_gas_per = missing_gas * 100 / len(df)
missing_gas_per, missing_gas_per.mean()
```

```
[5]: (THERM JANUARY 2010
                               3.325827
      THERM FEBRUARY 2010
                               6.311614
      THERM MARCH 2010
                               2.210258
      THERM APRIL 2010
                               2.348958
      THERM MAY 2010
                               2.769534
      THERM JUNE 2010
                               2.635307
      THERM JULY 2010
                               2.714352
      THERM AUGUST 2010
                               2.845595
      THERM SEPTEMBER 2010
                               3.403380
      THERM OCTOBER 2010
                               2.568194
      THERM NOVEMBER 2010
                               2.325096
      THERM DECEMBER 2010
                               2.302725
      dtype: float64,
      2.9800698970435437)
```

#### 1.2 Sustituir categóricos

Existen ciertas columnas que mezclan valores numéricos y categóricos, como *ELECTRICITY AC-COUNTS* y *GAS ACCOUNTS*, donde se muestra el número de contadores de energía o gas de cada zona. Se pasarán los valores categóricos a numéricos, fijando arbitrariamente un valor único para estas filas.

Sustituimos todos los valores con Less than 4 en la columna ELECTRICITY ACCOUNTS por 3.

```
[6]: acc = df['ELECTRICITY ACCOUNTS'].unique()
res_match = [re.match(r"\D.*", e) for e in acc if e is not np.nan]
res_match = [e for e in res_match if e is not None]
res_match
```

[6]: [<re.Match object; span=(0, 11), match='Less than 4'>]

```
[7]: df['ELECTRICITY ACCOUNTS'] = df['ELECTRICITY ACCOUNTS'].str.replace('Less than_
       \hookrightarrow4', '3')
 [8]: df['ELECTRICITY ACCOUNTS'] = pd.to_numeric(df['ELECTRICITY ACCOUNTS'])
 [9]: df['ELECTRICITY ACCOUNTS']
 [9]: 0
                NaN
                8.0
      1
      2
                NaN
      3
                NaN
      4
                NaN
      67046
                6.0
      67047
                9.0
      67048
                7.0
      67049
                7.0
      67050
               12.0
      Name: ELECTRICITY ACCOUNTS, Length: 67051, dtype: float64
     Sustituimos todos los valores con Less than 4 en la columna GAS ACCOUNTS
[10]: acc = df['GAS ACCOUNTS'].unique()
      res_match = [re.match(r"\D.*", e) for e in acc if e is not np.nan]
      res_match = [e for e in res_match if e is not None]
      res match
[10]: [<re.Match object; span=(0, 11), match='Less than 4'>]
[11]: df['GAS ACCOUNTS'] = df['GAS ACCOUNTS'].str.replace('Less than 4', '3')
[12]: df['GAS ACCOUNTS'] = pd.to_numeric(df['GAS ACCOUNTS'])
[13]: df['GAS ACCOUNTS']
[13]: 0
               11.0
      1
                NaN
      2
                4.0
      3
                3.0
      4
                3.0
      67046
                9.0
                8.0
      67047
      67048
                5.0
      67049
                5.0
      67050
               13.0
      Name: GAS ACCOUNTS, Length: 67051, dtype: float64
```

Ya se tienen todos los datos con los tipos de datos acorde a la información que aportan. A continuación salvamos el dataset en un fichero csv nuevo.

### [14]: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 67051 entries, 0 to 67050
Data columns (total 73 columns):

#	Column	Non-Null Count	Dtype
0	COMMUNITY AREA NAME	67051 non-null	object
1	CENSUS BLOCK	66974 non-null	float64
2	BUILDING TYPE	66974 non-null	object
3	BUILDING_SUBTYPE	66974 non-null	object
4	KWH JANUARY 2010	66180 non-null	float64
5	KWH FEBRUARY 2010	66180 non-null	float64
6	KWH MARCH 2010	66180 non-null	float64
7	KWH APRIL 2010	66180 non-null	float64
8	KWH MAY 2010	66180 non-null	float64
9	KWH JUNE 2010	66180 non-null	float64
10	KWH JULY 2010	66180 non-null	float64
11	KWH AUGUST 2010	66180 non-null	float64
12	KWH SEPTEMBER 2010	66180 non-null	float64
13	KWH OCTOBER 2010	66180 non-null	float64
14	KWH NOVEMBER 2010	66180 non-null	float64
15	KWH DECEMBER 2010	66180 non-null	float64
16	TOTAL KWH	66180 non-null	float64
17	ELECTRICITY ACCOUNTS	66180 non-null	float64
18	ZERO KWH ACCOUNTS	67051 non-null	int64
19	THERM JANUARY 2010	64821 non-null	float64
20	THERM FEBRUARY 2010	62819 non-null	float64
21	THERM MARCH 2010	65569 non-null	float64
22	THERM APRIL 2010	65476 non-null	float64
23	THERM MAY 2010	65194 non-null	float64
24	THERM JUNE 2010	65284 non-null	float64
25	THERM JULY 2010	65231 non-null	float64
26	THERM AUGUST 2010	65143 non-null	float64
27	THERM SEPTEMBER 2010	64769 non-null	float64
28	THERM OCTOBER 2010	65329 non-null	float64
29	THERM NOVEMBER 2010	65492 non-null	float64
30	THERM DECEMBER 2010	65507 non-null	float64
31	TOTAL THERMS	65755 non-null	float64
32	GAS ACCOUNTS	65755 non-null	float64
33	KWH TOTAL SQFT	65901 non-null	float64
34	THERMS TOTAL SQFT	65378 non-null	float64
35	KWH MEAN 2010	66180 non-null	float64
36	KWH STANDARD DEVIATION 2010	57095 non-null	float64
37	KWH MINIMUM 2010	66180 non-null	float64

```
38 KWH 1ST QUARTILE 2010
                                         66180 non-null float64
 39 KWH 2ND QUARTILE 2010
                                         66180 non-null float64
40 KWH 3RD QUARTILE 2010
                                         66180 non-null float64
 41 KWH MAXIMUM 2010
                                         66180 non-null float64
 42 KWH SQFT MEAN 2010
                                         65901 non-null float64
                                         51666 non-null float64
 43 KWH SQFT STANDARD DEVIATION 2010
 44 KWH SQFT MINIMUM 2010
                                         65901 non-null float64
 45 KWH SQFT 1ST QUARTILE 2010
                                         65901 non-null float64
 46 KWH SQFT 2ND QUARTILE 2010
                                         65901 non-null float64
    KWH SQFT 3RD QUARTILE 2010
 47
                                         65901 non-null float64
 48 KWH SQFT MAXIMUM 2010
                                         65901 non-null float64
    THERM MEAN 2010
                                         65755 non-null float64
50 THERM STANDARD DEVIATION 2010
                                         56821 non-null float64
 51
   THERM MINIMUM 2010
                                         65755 non-null float64
52 THERM 1ST QUARTILE 2010
                                         65755 non-null float64
 53 THERM 2ND QUARTILE 2010
                                         65755 non-null float64
 54 THERM 3RD QUARTILE 2010
                                         65755 non-null float64
 55 THERM MAXIMUM 2010
                                         65755 non-null float64
 56 THERMS SQFT MEAN 2010
                                         65378 non-null float64
 57 THERMS SQFT STANDARD DEVIATION 2010 51367 non-null float64
    THERMS SQFT MINIMUM 2010
                                         65378 non-null float64
 59 THERMS SQFT 1ST QUARTILE 2010
                                         65378 non-null float64
 60 THERMS SQFT 2ND QUARTILE 2010
                                         65378 non-null float64
 61 THERMS SQFT 3RD QUARTILE 2010
                                         65378 non-null float64
 62 THERMS SQFT MAXIMUM 2010
                                         65378 non-null float64
 63 TOTAL POPULATION
                                         67037 non-null float64
 64 TOTAL UNITS
                                         67037 non-null float64
                                         67051 non-null float64
    AVERAGE STORIES
                                         67051 non-null float64
   AVERAGE BUILDING AGE
    AVERAGE HOUSESIZE
                                         67037 non-null float64
    OCCUPIED UNITS
                                         67037 non-null float64
    OCCUPIED UNITS PERCENTAGE
                                         64606 non-null float64
 70 RENTER-OCCUPIED HOUSING UNITS
                                         67037 non-null float64
 71 RENTER-OCCUPIED HOUSING PERCENTAGE
                                         64433 non-null float64
72 OCCUPIED HOUSING UNITS
                                         67037 non-null float64
dtypes: float64(69), int64(1), object(3)
memory usage: 37.3+ MB
```

[15]: df.to\_csv("energy-usage-2010-clean.csv", index=False)