Updated on 5th February, 2024: NUTS 1 and NUTS 2 information added

Classfying the postal codes into urban/rural typology

```
In [1]: # importing libraries

import pandas as pd
import numpy as np
```

Urban/rural typology of NUTS3 regions

A NUTS 3 region is classified as:

predominantly urban (PU), if the share of population living in rural LAU2 is below 15 %; **intermediate (IN)**, if the share of population living in rural LAU2 is between 15 % and 50 %; **predominantly rural (PR)**, if the share of population living in rural LAU2 is higher than 50 %.

Local Administrative Units (LAUs): low level administrative divisions of a country below that of a province.

Rural LAU2: LAU2s with a *population density* below 150 inhabitants per km² (The OECD methodology, https://ec.europa.eu/eurostat/statistics-explained/index.php?title=Archive:Urban-rural_typology#cite_note-1)

Source: European Commission (DG REGIO and DG AGRI) https://ec.europa.eu/eurostat/statistics-explained/index.php?title=Archive:Urban-rural_typology

Data source for the postal code and NUTS id:

https://ec.europa.eu/eurostat/de/web/nuts/correspondence-tables/

https://ec.europa.eu/eurostat/de/web/nuts/correspondence-tables/postcodes-and-nuts

I joined the urban classification with NUTS 3 ID table and the postal codes for NUTS 3 ID to get the final output of urban classification by postal codes.

```
In [74]: # loading the csv file for Urban/rural typology of NUTS3 regions
df_class = pd.read_csv('Urban_rural_typology_of_NUTS_3_regions_DE.csv', encoding='cp12
df_class.head(9)
```

```
NUTS_ID
                             NUTS_NAME category
Out[74]:
                                                ΡU
           0
                DE111
                        Stuttgart, Stadtkreis
           1
                DE112
                                Böblingen
                                                PU
           2
                                                PU
                DE113
                                 Esslingen
           3
                DE114
                                Göppingen
                                                 IN
           4
                DE115
                              Ludwigsburg
                                                PU
           5
                DE116
                           Rems-Murr-Kreis
                                                PU
           6
                DE117 Heilbronn, Stadtkreis
                                                 IN
           7
                DE118
                        Heilbronn, Landkreis
                                                 IN
           8
                DE119
                                                 IN
                            Hohenlohekreis
           df_class['NUTS1_ID'] = df_class['NUTS_ID'].astype(str).str[:3]
In [75]:
           df_class.head(9)
Out[75]:
              NUTS ID
                             NUTS_NAME category NUTS1_ID
                                                PU
                                                          DE1
           0
                DE111
                        Stuttgart, Stadtkreis
                DE112
                                                PU
           1
                                Böblingen
                                                          DE1
           2
                DE113
                                 Esslingen
                                                PU
                                                          DE1
           3
                DE114
                                Göppingen
                                                 IN
                                                          DE1
           4
                DE115
                              Ludwigsburg
                                                PU
                                                          DE1
           5
                DE116
                           Rems-Murr-Kreis
                                                PU
                                                          DE1
           6
                DE117 Heilbronn, Stadtkreis
                                                 IN
                                                          DE1
           7
                DE118
                        Heilbronn, Landkreis
                                                 IN
                                                          DE1
           8
                DE119
                            Hohenlohekreis
                                                 IN
                                                          DE1
           df_class['NUTS1_ID'].unique()
In [76]:
           array(['DE1', 'DE2', 'DE3', 'DE4', 'DE5', 'DE6', 'DE7', 'DE8', 'DE9',
Out[76]:
                   'DEA', 'DEB', 'DEC', 'DED', 'DEE', 'DEF', 'DEG'], dtype=object)
           df_class['NUTS1_ID'].nunique()
In [77]:
           16
Out[77]:
In [78]:
           df_class.dtypes
          NUTS_ID
                         object
Out[78]:
          NUTS_NAME
                         object
           category
                         object
           NUTS1 ID
                         object
           dtype: object
In [79]:
           len(df_class)
```

Out[79]:

429

```
In [80]: # Loading the file with NUTS3 ID and postal codes
         df_plz = pd.read_csv('pc2020_DE_NUTS-2021_v4.0.csv', sep= ";")
         #df_plz[['NUTS3','postal_code']] = df_plz['NUTS3;CODE'].str.split(';',expand=True)
         df_plz['NUTS3'] = df_plz['NUTS3'].str.replace('\'', '')
         df_plz['CODE'] = df_plz['CODE'].str.replace('\'', '')
         #df_plz = df_plz[['NUTS3','postal_code']]
         df_plz.head(9)
```

```
Out[80]:
           NUTS3 CODE
         0 DEA1D 41363
         1 DEA1E 41366
         2 DEA1E 41748
         3 DEA1E 41749
         4 DEA1E 41751
         5 DEA1E 41747
         6 DEA23 50667
         7 DEA23 50668
         8 DEA23 50670
```

```
In [81]: df_plz['NUTS1_ID'] = df_plz['NUTS3'].astype(str).str[:3]
         df_plz
```

Out[81]:		NUTS3	CODE	NUTS1_ID
	0	DEA1D	41363	DEA
	1	DEA1E	41366	DEA
	2	DEA1E	41748	DEA
	3	DEA1E	41749	DEA
	4	DEA1E	41751	DEA
	•••			
	8315	DE722	35641	DE7
	8316	DE724	35080	DE7
	8317	DE725	35315	DE7
	8318	DE914	38543	DE9
	8319	DE712	60312	DE7

8320 rows × 3 columns

Out[85]:		NUTS3	CODE	NUTS1_ID
	197	DE405	16352	DE4
	198	DE40A	16565	DE4
	199	DE40D	16918	DE4
	320	DE40I	03202	DE4
	1360	DE406	15755	DE4
	•••			
	8111	DE409	15366	DE4
	8162	DE40D	16835	DE4
	8174	DE40F	19309	DE4
	8209	DE407	03253	DE4
	8229	DE40F	19357	DE4

227 rows × 3 columns

```
In [86]: de4_class = df_class[df_class['NUTS1_ID'] == 'DE4']
    de4_class
```

Out[86]:

	NUTS_ID	NUTS_NAME	category	NUTS1_ID
141	DE411	Frankfurt (Oder), Kreisfreie Stadt	IN	DE4
142	DE412	Barnim	IN	DE4
143	DE413	Märkisch-Oderland	IN	DE4
144	DE414	Oberhavel	IN	DE4
145	DE415	Oder-Spree	IN	DE4
146	DE416	Ostprignitz-Ruppin	PR	DE4
147	DE417	Prignitz	PR	DE4
148	DE418	Uckermark	PR	DE4
149	DE421	Brandenburg an der Havel, Kreisfreie Stadt	IN	DE4
150	DE422	Cottbus, Kreisfreie Stadt	IN	DE4
151	DE423	Potsdam, Kreisfreie Stadt	IN	DE4
152	DE424	Dahme-Spreewald	IN	DE4
153	DE425	Elbe-Elster	PR	DE4
154	DE426	Havelland	IN	DE4
155	DE427	Oberspreewald-Lausitz	IN	DE4
156	DE428	Potsdam-Mittelmark	IN	DE4
157	DE429	Spree-Neiße	IN	DE4
158	DE42A	Teltow-Fläming	PR	DE4

Debugging: NUTS3 ID for DE4 in PLZ differ from the classification data

```
# NUTS3 in PLZ data: this seems correct
In [87]:
                               np.sort(de4_plz['NUTS3'].unique())
                               array(['DE401', 'DE402', 'DE403', 'DE404', 'DE405', 'DE406', 'DE407',
Out[87]:
                                                       'DE408', 'DE409', 'DE40A', 'DE40B', 'DE40C', 'DE40D', 'DE40E',
                                                       'DE40F', 'DE40G', 'DE40H', 'DE40I'], dtype=object)
                               # NUTS3 in classification data
In [88]:
                               np.sort(de4_class['NUTS_ID'].unique())
                               array(['DE411', 'DE412', 'DE413', 'DE414', 'DE415', 'DE416', 'DE417',
Out[88]:
                                                      'DE418', 'DE421', 'DE422', 'DE423', 'DE424', 'DE425', 'DE426',
                                                      'DE427', 'DE428', 'DE429', 'DE42A'], dtype=object)
In [89]: # change the NUTS_ID in the classification file according to the NUTS3 level names and
                               de4_nuts2012 = pd.DataFrame({"Code2021":['DE401','DE402','DE403','DE404','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE405','DE40
                                                                                                                                         'DE409', 'DE40A', 'DE40B', 'DE40C', 'DE40D', 'DE40E', 'DE40F
                                                                                                                                  "NUTS_level3":['Brandenburg an der Havel, Kreisfreie Sta
                                                                                                                                                                                   'Frankfurt (Oder), Kreisfreie Stadt', 'Pot
```

```
'Dahme-Spreewald', 'Elbe-Elster', 'Havell
'Oberhavel', 'Oberspreewald-Lausitz', 'Oc
'Potsdam-Mittelmark', 'Prignitz', 'Spree-
de4_nuts2012
```

Out[89]:		Code2021	NUTS_level3
	0	DE401	Brandenburg an der Havel, Kreisfreie Stadt
	1	DE402	Cottbus, Kreisfreie Stadt
	2	DE403	Frankfurt (Oder), Kreisfreie Stadt
	3	DE404	Potsdam, Kreisfreie Stadt
	4	DE405	Barnim
	5	DE406	Dahme-Spreewald
	6	DE407	Elbe-Elster
	7	DE408	Havelland
	8	DE409	Märkisch-Oderland
	9	DE40A	Oberhavel
	10	DE40B	Oberspreewald-Lausitz
	11	DE40C	Oder-Spree
	12	DE40D	Ostprignitz-Ruppin
	13	DE40E	Potsdam-Mittelmark
	14	DE40F	Prignitz
	15	DE40G	Spree-Neiße
	16	DE40H	Teltow-Fläming
	17	DE40I	Uckermark

```
In [90]: ## testing - change the values by mapping in the classification data

de4_class['NUTS_ID'] = de4_class['NUTS_ID'].map({'DE411': 'DE403', 'DE412': 'DE405', 'DE416': 'DE406', 'DE416': 'DE400', 'DE421': 'DE406', 'DE422': 'DE402', 'DE425': 'DE407', 'DE426': 'DE408', 'DE429': 'DE406', 'DE42A': 'DE40H'})

pd.merge(de4_class, de4_nuts2012, left_on = ['NUTS_ID'], right_on = ['Code2021'], how

C:\Users\leajo\AppData\Local\Temp\ipykernel_18940\1997341574.py:3: SettingWithCopyWarning:
    A value is trying to be set on a copy of a slice from a DataFrame.
    Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
    de4_class['NUTS_ID'] = de4_class['NUTS_ID'].map({'DE411': 'DE403', 'DE412': 'DE406', 'DE413': 'DE409', 'DE414': 'DE400A',
```

Out[90]:	: NUTS_ID		NUTS_NAME		category NUTS1_ID Code2021		Code2021	NUTS_level3
	0	DE403	Frankfurt (Oder), K	reisfreie Stadt	IN	DE4	DE403	Frankfurt (Oder), Kreisfreie Stadt
	1	DE405	5 Barnim		IN	DE4	DE405	Barnim
	2 DE409		Märkisch-O	derland	IN	DE4	DE409	Märkisch-Oderland
	3	DE40A	Ob	erhavel	IN	DE4	DE40A	Oberhavel
	4	DE40C	Ode	r-Spree	IN	DE4	DE40C	Oder-Spree
	5	DE40D	Ostprignitz	-Ruppin	PR	DE4	DE40D	Ostprignitz-Ruppin
	6	DE40F		Prignitz	PR	DE4	DE40F	Prignitz
	7	DE40I	Ucl	kermark	PR	DE4	DE40I	Uckermark
	8	DE401	Brandenburg an de Kreisfre	r Havel, ie Stadt	IN	DE4	DE401	Brandenburg an der Havel, Kreisfreie Stadt
	9	DE402	Cottbus, Kreisfre	ie Stadt	IN	DE4	DE402	Cottbus, Kreisfreie Stadt
	10	DE404	Potsdam, Kreisfre	ie Stadt	IN	DE4	DE404	Potsdam, Kreisfreie Stadt
	11	DE406	Dahme-Sp	reewald	IN	DE4	DE406	Dahme-Spreewald
	12 DE407		Elb	e-Elster	PR	DE4	DE407	Elbe-Elster
	13	DE408	На	evelland	IN	DE4	DE408	Havelland
	14	DE40B	Oberspreewald	-Lausitz	IN	DE4	DE40B	Oberspreewald-Lausitz
	15	DE40E	Potsdam-Mit	Potsdam-Mittelmark		DE4	DE40E	Potsdam-Mittelmark
	16	DE40G	Spree-Neiße		IN	DE4	DE40G	Spree-Neiße
	17	DE40H	Teltow-	PR	DE4	DE40H	Teltow-Fläming	
In [91]:	<pre>: ## change the values by mapping in the classification data df_class['NUTS_ID'] = df_class['NUTS_ID'].map({'DE411': 'DE403', 'DE412': 'DE405'</pre>							
In [92]:	df_c	class.he	ad()					
Out[92]:	N	IUTS_ID	NUTS_NAME	category	y NUTS1	_ID		
	0	NaN	Stuttgart, Stadtkreis	Pl	J C	DE1		
	1	NaN	Böblingen	Pl	J C	DE1		
	2	NaN	Esslingen	Pl	J C	DE1		
	3	NaN	Göppingen	II.	N D	DE1		

PU

DE1

Ludwigsburg

4

NaN

Merge with the clean data

```
## load df_class again
In [93]:
          df_class2 = pd.read_csv('Urban_rural_typology_of_NUTS_3_regions_DE.csv', encoding='cp1
          df class2.head(9)
Out[93]:
             NUTS ID
                            NUTS_NAME category
                                              PU
               DE111
                       Stuttgart, Stadtkreis
          1
               DE112
                               Böblingen
                                              PU
          2
               DE113
                                              PU
                               Esslingen
          3
               DE114
                                              IN
                              Göppingen
          4
               DE115
                             Ludwigsburg
                                              PU
          5
               DE116
                         Rems-Murr-Kreis
                                              PU
          6
               DE117 Heilbronn, Stadtkreis
                                              IN
          7
                      Heilbronn, Landkreis
               DE118
                                              IN
          8
               DE119
                          Hohenlohekreis
                                              IN
In [94]: DE4_map = {'DE411': 'DE403', 'DE412': 'DE405', 'DE413': 'DE409', 'DE414': 'DE40A',
                                                               'DE415': 'DE40C', 'DE416': 'DE40D',
                                                               'DE421': 'DE401', 'DE422': 'DE402',
                                                               'DE425': 'DE407', 'DE426': 'DE408',
                                                               'DE429': 'DE40G', 'DE42A': 'DE40H'}
          for key, value in DE4_map.items():
              df_class2['NUTS_ID'].mask(df_class2['NUTS_ID'] == key, value, inplace=True)
In [95]: # Creating NUTS1 ID column
          df_class2['NUTS1_ID'] = df_class['NUTS_ID'].astype(str).str[:3]
          df_class2.head()
Out[95]:
             NUTS ID
                           NUTS NAME category NUTS1 ID
          0
               DE111
                      Stuttgart, Stadtkreis
                                             PU
                                                       nan
          1
               DE112
                              Böblingen
                                             PU
                                                       nan
          2
               DE113
                               Esslingen
                                             PU
                                                       nan
          3
               DE114
                             Göppingen
                                             IN
                                                       nan
                                             PU
          4
               DE115
                            Ludwigsburg
                                                       nan
In [96]: test3= df_class2[df_class2['NUTS1_ID'] == 'DE4']
          test3['NUTS_ID'].unique()
          array(['DE403', 'DE405', 'DE409', 'DE40A', 'DE40C', 'DE40D', 'DE40F',
Out[96]:
                  'DE40I', 'DE401', 'DE402', 'DE404', 'DE406', 'DE407', 'DE408',
```

'DE40B', 'DE40E', 'DE40G', 'DE40H'], dtype=object)

```
In [97]: ## Merging the PLZ and classification data after fixing the discrepancies in DE3 NUTS3

df_with_null = pd.merge(df_plz, df_class2, left_on = ['NUTS3'], right_on = ['NUTS_ID']

df_with_null = df_with_null[['NUTS3', 'CODE', 'NUTS_NAME', 'category']]

df_with_null.head(10)
```

Out[97]:		NUTS3	CODE	NUTS_NAME	category
	0	DEA1D	41363	Rhein-Kreis Neuss	PU
	1	DEA1E	41366	Viersen	PU
	2	DEA1E	41748	Viersen	PU
	3	DEA1E	41749	Viersen	PU
	4	DEA1E	41751	Viersen	PU
	5	DEA1E	41747	Viersen	PU
	6	DEA23	50667	Köln, Kreisfreie Stadt	PU
	7	DEA23	50668	Köln, Kreisfreie Stadt	PU
	8	DEA23	50670	Köln, Kreisfreie Stadt	PU
	9	DEA29	41836	Heinsberg	PU

```
In [98]: df_with_null['NUTS1_ID'] = df_with_null['NUTS3'].astype(str).str[:3]
    df_with_null.head(10)
```

```
NUTS3 CODE
Out[98]:
                                   NUTS_NAME category NUTS1_ID
           0 DEA1D 41363
                                                                DEA
                               Rhein-Kreis Neuss
                                                      PU
              DEA1E 41366
                                        Viersen
                                                      PU
                                                                DEA
              DEA1E 41748
                                                      PU
                                                                DEA
                                        Viersen
              DEA1E 41749
                                                      PU
                                        Viersen
                                                                DEA
              DEA1E 41751
                                                      PU
                                                                DEA
                                        Viersen
              DEA1E 41747
                                                      PU
                                                                DEA
                                        Viersen
              DEA23 50667 Köln, Kreisfreie Stadt
                                                      PU
                                                                DEA
              DEA23 50668 Köln, Kreisfreie Stadt
                                                      PU
                                                                DEA
              DEA23 50670 Köln, Kreisfreie Stadt
                                                      PU
                                                                DEA
              DEA29 41836
                                                      PU
                                                                DEA
                                      Heinsberg
```

DEA

DEA1

```
In [101... df_with_null['NUTS2_ID'] = df_with_null['NUTS3'].astype(str).str[:4]
df_with_null.head(10)

Out[101]: NUTS3 CODE NUTS_NAME category NUTS1_ID NUTS2_ID
```

PU

Rhein-Kreis Neuss

```
PU
                                                             DEA
              DEA1E 41366
                                       Viersen
                                                                       DEA1
              DEA1E 41748
                                                    PU
                                                             DEA
                                                                       DEA1
                                       Viersen
              DEA1E 41749
                                       Viersen
                                                    PU
                                                             DEA
                                                                       DEA1
              DEA1E 41751
                                       Viersen
                                                    PU
                                                             DEA
                                                                       DEA1
              DEA1E 41747
                                       Viersen
                                                    PU
                                                             DEA
                                                                       DEA1
                                                                       DEA2
              DEA23 50667 Köln, Kreisfreie Stadt
                                                    PU
                                                             DEA
                                                                       DEA2
                                                    PU
              DEA23 50668
                            Köln, Kreisfreie Stadt
                                                             DEA
              DEA23 50670 Köln, Kreisfreie Stadt
                                                    PU
                                                             DEA
                                                                       DEA2
              DEA29 41836
                                                    PU
                                                             DEA
                                                                       DEA2
                                     Heinsberg
           df_with_null['NUTS2_ID'].unique()
In [102...
           array(['DEA1', 'DEA2', 'DEA3', 'DEA4', 'DEA5', 'DED4', 'DE80', 'DEE0',
Out[102]:
                   'DEF0', 'DE93', 'DE40', 'DE91', 'DE92', 'DE94', 'DE50', 'DE71',
                   'DEB1', 'DEB2', 'DEB3', 'DE11', 'DE12', 'DE13', 'DE14', 'DE21',
                   'DE22', 'DE27', 'DE23', 'DE24', 'DE25', 'DED2', 'DED5', 'DEG0',
                   'DE26', 'DE72', 'DE73', 'DEC0', 'DE30', 'DE60'], dtype=object)
```

In [103... df_with_null['NUTS2_ID'].nunique()

0 DEA1D 41363

Out[103]:

In [104... df_with_null[df_with_null['NUTS1_ID'] == 'DE4']

Out[104]:		NUTS3	CODE	NUTS_NAME	category	NUTS1_ID	NUTS2_ID
	197	DE405	16352	Barnim	IN	DE4	DE40
	198	DE40A	16565	Oberhavel	IN	DE4	DE40
	199	DE40D	16918	Ostprignitz-Ruppin	PR	DE4	DE40
	320	DE40I	03202	Uckermark	PR	DE4	DE40
	1360	DE406	15755	Dahme-Spreewald	IN	DE4	DE40
	•••						
	8111	DE409	15366	Märkisch-Oderland	IN	DE4	DE40
	8162	DE40D	16835	Ostprignitz-Ruppin	PR	DE4	DE40
	8174	DE40F	19309	Prignitz	PR	DE4	DE40
	8209	DE407	03253	Elbe-Elster	PR	DE4	DE40
	8229	DE40F	19357	Prignitz	PR	DE4	DE40

227 rows × 6 columns

Adding other NUTS level

used file: NUTS2021

source: https://ec.europa.eu/eurostat/de/web/nuts/background

```
In [105...
```

```
## Adding NUTS1

NUTS1 = pd.read_csv('NUTS1.csv', encoding='cp1252')
NUTS1
```

Out[105]:	Code 2021		NUTS level 1
	0	DE1	Baden-Württemberg
	1	DE2	Bayern
	2	DE3	Berlin
	3	DE4	Brandenburg
	4	DE5	Bremen
	5	DE6	Hamburg
	6	DE7	Hessen
	7	DE8	Mecklenburg-Vorpommern
	8	DE9	Niedersachsen
	9	DEA	Nordrhein-Westfalen
	10	DEB	Rheinland-Pfalz
	11	DEC	Saarland
	12	DED	Sachsen
	13	DEE	Sachsen-Anhalt
	14	DEF	Schleswig-Holstein
	15	DEG	Thüringen
	16	DEZ	Extra-Regio NUTS 1

```
In [106... ## Adding NUTS2
NUTS2 = pd.read_csv('NUTS2.csv', encoding='cp1252')
NUTS2
```

Out[106]:

	Code 2021	NUTS level 2
0	DE11	Stuttgart
1	DE12	Karlsruhe
2	DE13	Freiburg
3	DE14	Tübingen
4	DE21	Oberbayern
5	DE22	Niederbayern
6	DE23	Oberpfalz
7	DE24	Oberfranken
8	DE25	Mittelfranken
9	DE26	Unterfranken
10	DE27	Schwaben
11	DE30	Berlin
12	DE40	Brandenburg
13	DE50	Bremen
14	DE60	Hamburg
15	DE71	Darmstadt
16	DE72	Gießen
17	DE73	Kassel
18	DE80	Mecklenburg-Vorpommern
19	DE91	Braunschweig
20	DE92	Hannover
21	DE93	Lüneburg
22	DE94	Weser-Ems
23	DEA1	Düsseldorf
24	DEA2	Köln
25	DEA3	Münster
26	DEA4	Detmold
27	DEA5	Arnsberg
28	DEB1	Koblenz
29	DEB2	Trier
30	DEB3	Rheinhessen-Pfalz
31	DEC0	Saarland
32	DED2	Dresden
33	DED4	Chemnitz

(Code 2021	NUTS level 2
34	DED5	Leipzig
35	DEE0	Sachsen-Anhalt
36	DEF0	Schleswig-Holstein
37	DEG0	Thüringen
38	DEZZ	Extra-Regio NUTS 2

In [107... df_with_null.head()

	_	
\cap $+$	[107]	
Uut	TO/	۰

	NUTS3	CODE	NUTS_NAME	category	NUTS1_ID	NUTS2_ID
0	DEA1D	41363	Rhein-Kreis Neuss	PU	DEA	DEA1
1	DEA1E	41366	Viersen	PU	DEA	DEA1
2	DEA1E	41748	Viersen	PU	DEA	DEA1
3	DEA1E	41749	Viersen	PU	DEA	DEA1
4	DEA1E	41751	Viersen	PU	DEA	DEA1

In [108... ### try left join instead

In [109...

df_with_null = pd.merge(df_with_null, NUTS1, left_on = ['NUTS1_ID'], right_on = ['Code
df_with_null.head(10)

Out[109]:

	NUTS3	CODE	NUTS_NAME	category	NUTS1_ID	NUTS2_ID	Code 2021	NUTS level 1
0	DEA1D	41363	Rhein-Kreis Neuss	PU	DEA	DEA1	DEA	Nordrhein- Westfalen
1	DEA1E	41366	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen
2	DEA1E	41748	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen
3	DEA1E	41749	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen
4	DEA1E	41751	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen
5	DEA1E	41747	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen
6	DEA23	50667	Köln, Kreisfreie Stadt	PU	DEA	DEA2	DEA	Nordrhein- Westfalen
7	DEA23	50668	Köln, Kreisfreie Stadt	PU	DEA	DEA2	DEA	Nordrhein- Westfalen
8	DEA23	50670	Köln, Kreisfreie Stadt	PU	DEA	DEA2	DEA	Nordrhein- Westfalen
9	DEA29	41836	Heinsberg	PU	DEA	DEA2	DEA	Nordrhein- Westfalen

In [110... df_with_null = pd.merge(df_with_null, NUTS2, left_on = ['NUTS2_ID'], right_on = ['Code
df_with_null.head(10)

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]:		NUTS3	CODE	NUTS_NAME	category	NUTS1_ID	NUTS2_ID	Code 2021_x	NUTS level 1	Code 2021_y	NU leve
	0	DEA1D	41363	Rhein-Kreis Neuss	PU	DEA	DEA1	DEA	Nordrhein- Westfalen	DEA1	Düsseld
	1	DEA1E	41366	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen	DEA1	Düsseld
	2	DEA1E	41748	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen	DEA1	Düsseld
	3	DEA1E	41749	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen	DEA1	Düsseld
	4	DEA1E	41751	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen	DEA1	Düsseld
	5	DEA1E	41747	Viersen	PU	DEA	DEA1	DEA	Nordrhein- Westfalen	DEA1	Düsseld
	6	DEA23	50667	Köln, Kreisfreie Stadt	PU	DEA	DEA2	DEA	Nordrhein- Westfalen	DEA2	Κί
	7	DEA23	50668	Köln, Kreisfreie Stadt	PU	DEA	DEA2	DEA	Nordrhein- Westfalen	DEA2	Ki
	8	DEA23	50670	Köln, Kreisfreie Stadt	PU	DEA	DEA2	DEA	Nordrhein- Westfalen	DEA2	Ki
	9	DEA29	41836	Heinsberg	PU	DEA	DEA2	DEA	Nordrhein- Westfalen	DEA2	Ki
											•
	df	_with_n	ull =	df_with_null	[['NUTS3'	', 'CODE',	'NUTS_NAM	1E', 'ca	tegory',	'NUTS1_I	D', 'NL

Out[111]:		NUTS3	CODE	NUTS_NAME	category	/ NUTS1_ID	NUTS2_ID	NUTS level 1	NUTS level 2
	0	DEA1D	41363	Rhein-Kreis Neuss	Pl	J DEA	DEA1	Nordrhein- Westfalen	I)HICCAIDAIT
	1	DEA1E	41366	Vierser	n PL	J DEA	DEA1	Nordrhein- Westfalen	I)LISSAIDORT
	2	DEA1E	41748	Vierser	n PL	J DEA	DEA1	Nordrhein- Westfalen	Diisseldort
	3	DEA1E	41749	Vierser	n PL	J DEA	DEA1	Nordrhein- Westfalen	I)LISSAIDORT
	4	DEA1E	41751	Vierser	n PL	J DEA	DEA1	Nordrhein- Westfalen	l)usseldort
	5	DEA1E	41747	Vierser	n PL	J DEA	DEA1	Nordrhein- Westfalen	I)LISSAIDORT
	6	DEA23	50667	Köln, Kreisfreie Stad	PI	J DEA	DEA2	Nordrhein- Westfalen	K∩In
	7	DEA23	50668	Köln, Kreisfreie Stad	Pl	J DEA	DEA2	Nordrhein- Westfalen	K∩In
	8	DEA23	50670	Köln, Kreisfreie Stad	Pl	J DEA	DEA2	Nordrhein- Westfalen	K∩In
	9	DEA29	41836	Heinsberg	g PL	J DEA	DEA2	Nordrhein- Westfalen	K∩In
In [112		_with_n _with_n		df_with_null.r	ename(co				NAME' : 'NUTS , 'NUTS level
Out[112]:		NUTS3_	ID PO	STAL_CODE NUT	S3_NAME	CLASSIFICAT	ION NUTS1_	ID NUTS2_ID	NUTS1_NAME
	0	DEA ²	1D	41363 R	hein-Kreis Neuss		PU D	EA DEA1	Nordrhein- Westfalen
	1	DEA	1E	41366	Viersen		PU D	EA DEA1	Nordrhein- Westfalen
	2	DEA	1E	41748	Viersen		PU D	EA DEA1	Nordrhein- Westfalen
	3	DEA	1E	41749	Viersen		PU D	EA DEA1	Nordrhein- Westfalen
	4	DEA	1E	41751	Viersen		PU D	EA DEA1	Nordrhein- Westfalen
4									>

missing classification

```
In [116... df_class_null = df_with_null[df_with_null['CLASSIFICATION'].isnull()]
    df_class_null.head()
```

Out[116]:	ı	NUTS3_ID	POSTAL_CODE	NUTS3_NAME	CLASSIFICATION	NUTS1_ID	NUTS2_ID	NUTS1_NAME				
	64	DEA2D	52249	NaN	NaN	DEA	DEA2	Nordrhein- Westfalen				
	65	DEA2D	52134	NaN	NaN	DEA	DEA2	Nordrhein- Westfaler				
	69	DEA2D	52499	NaN	NaN	DEA	DEA2	Nordrhein- Westfaler				
	70	DEA2D	52159	NaN	NaN	DEA	DEA2	Nordrhein- Westfaler				
	88	DEA2D	52152	NaN	NaN	DEA	DEA2	Nordrhein- Westfaler				
1												
in [117	len(df_class_	_null)									
ut[117]:	GEA.											
n [118	<pre>df_class_null['NUTS1_ID'].unique()</pre>											
Out[118]:	annay([DEA] DEB] DEB] DEB] dtymo_object)											
In [119	<pre>df_not_null = df_with_null[df_with_null['CLASSIFICATION'].notnull()] len(df_not_null)</pre>											
out[119]:	7666											
n [120	_		Final = df_not_ Final.head()	_null[['NUTS	3_ID','NUTS1_NA	ME', 'NUTS	S2_NAME',	'NUTS3_NAME'				
out[120]:	N	UTS3_ID	NUTS1_NAMI	E NUTS2_NAM	IE NUTS3_NAM	IE POSTAL	CODE CLA	SSIFICATION				
	0	DEA1D	Nordrhein Westfaler	I)HICCAIMA	Rhein-Kre orf Neu:		41363	PU				
	1	DEA1E	Nordrhein Westfaler	I)HICCAIMA	orf Vierse	en	41366	PU				
	2	DEA1E	Nordrhein Westfaler	I)HICCAIMA	orf Vierse	en	41748	PU				
	3	DEA1E	Nordrhein Westfaler	I)HICCAIMA	orf Vierse	n	41749	PU				
	4	DEA1E	Nordrhein Westfaler	ווווככבותר	orf Vierse	en	41751	PU				
n [121	df_n	ot_null_f	final.to_csv('	classificati	on_urban_by_pos	tal_code.d	csv', enco	ding='cp1252				
	df_class_null_final = df_class_null[['NUTS3_ID','NUTS1_NAME', 'NUTS2_NAME', 'NUTS3_NA											
in [125			L_final = df_cl L_final.head()	lass_null[['	NUTS3_ID','NUTS	1_NAME',	'NUTS2_NAM	E', 'NUTS3_N				

Out[125]:		NUTS3_ID	NUTS1_NAME	NUTS2_NAME	NUTS3_NAME	POSTAL_CODE	CLASSIFICATION
	64	DEA2D	Nordrhein- Westfalen	Köln	NaN	52249	NaN
	65	DEA2D	Nordrhein- Westfalen	Köln	NaN	52134	NaN
	69	DEA2D	Nordrhein- Westfalen	Köln	NaN	52499	NaN
	70	DEA2D	Nordrhein- Westfalen	Köln	NaN	52159	NaN
	88	DEA2D	Nordrhein- Westfalen	Köln	NaN	52152	NaN
In [126	df_	class_null_ [.]	final.to_csv('c	lassification	_missing_by_p	ostal_code.cs	v', encoding='cp1

There are unclassified postal codes that needs further investigation:

It means if the postal code of the respondent is one of these 881 postal codes, we do not know their classification.

Today there are 28,278 different postal codes assigned in Germany, of which 8,181 are for towns, 16,137 for PO boxes, 3,095 for major customers and 865 are so-called "action postal codes" (e.g. for competitions). Three buildings in Frankfurt aM also have their own postal code, namely Messeturm (60308), Opernturm (60306) and Taunusturm (60310). The fourth German building with its own delivery zip code is the Schneefernerhaus on the Zugspitze (82475). With the bridegroom oak in the Dodauer Forest in Eutin, even a single tree can be reached under a zip code (23701).

234 places in Germany have more than one postal code. Berlin is the city with the most so-called "delivery postcodes" (190), followed by Hamburg with 100 and Munich with 75. Of the federal states, North Rhine-Westphalia has the most active postal codes and Bremen has the fewest.

https://group.dhl.com/de/presse/pressemitteilungen/2018/25-jahre-fuenfstellige-postleitzahlen-in-

deutschland.html#:~:text=Heute%20sind%20in%20Deutschland%2028.278,%22Aktions%2DPLZ%22



https://tbed.org/eudemo/index.php? tablename=nuts3_vw&function=details&where_field=nuts_code&where_value=DEA2D