cleaning-student

April 15, 2020

0.1 Gather

```
In [248]: import pandas as pd
          import numpy as np
In [249]: patients = pd.read_csv('patients.csv')
          treatments = pd.read_csv('treatments.csv')
          adverse_reactions = pd.read_csv('adverse_reactions.csv')
0.2 Assess
In [250]: patients.head()
Out [250]:
                                                                              address
             patient_id assigned_sex given_name
                                                  surname
          0
                      1
                               female
                                             Zoe
                                                  Wellish
                                                                 576 Brown Bear Drive
                      2
          1
                              female
                                          Pamela
                                                     Hill
                                                           2370 University Hill Road
          2
                      3
                                                   Debord
                                                                1493 Poling Farm Road
                                 male
                                             Jae
          3
                      4
                                 male
                                            Liêm
                                                     Phan
                                                                  2335 Webster Street
                      5
                                 male
                                                                 1428 Turkey Pen Lane
                                             Tim Neudorf
                                      state zip_code
                          city
                                                              country
             Rancho California California
                                              92390.0
                                                       United States
          1
                                   Illinois
                                                       United States
                     Armstrong
                                              61812.0
          2
                                                       United States
                          York
                                   Nebraska
                                              68467.0
          3
                    Woodbridge
                                         NJ
                                               7095.0
                                                       United States
                        Dothan
                                         ΑL
                                              36303.0 United States
                                                 contact
                                                          birthdate weight
                                                                             height
                                                                                       bmi
          0
                                                                       121.7
                                                                                      19.6
                   951-719-9170ZoeWellish@superrito.com
                                                          7/10/1976
                                                                                  66
          1
                  PamelaSHill@cuvox.de+1 (217) 569-3204
                                                           4/3/1967
                                                                       118.8
                                                                                  66 19.2
          2
                       402-363-6804JaeMDebord@gustr.com
                                                          2/19/1980
                                                                       177.8
                                                                                  71
                                                                                      24.8
             PhanBaLiem@jourrapide.com+1 (732) 636-8246
                                                          7/26/1951
                                                                       220.9
                                                                                  70
                                                                                      31.7
                        334-515-7487TimNeudorf@cuvox.de 2/18/1928
                                                                       192.3
                                                                                      26.1
In [251]: treatments.head()
Out [251]:
            given_name
                                       auralin
                                                  novodra hba1c_start
                                                                         hba1c_end \
                           surname
          0
              veronika
                          jindrová 41u - 48u
                                                                   7.63
                                                                              7.20
```

```
elliot richardson
                                              - 40u - 45u
                                                                   7.56
                                                                               7.09
          1
          2
                                                39u - 36u
                                                                   7.68
                                                                               7.25
              yukitaka
                           takenaka
          3
                  skye
                        gormanston 33u - 36u
                                                                   7.97
                                                                               7.62
          4
                alissa
                            montez
                                                33u - 29u
                                                                   7.78
                                                                               7.46
             hba1c_change
                      NaN
                     0.97
          1
          2
                      {\tt NaN}
          3
                     0.35
          4
                     0.32
In [252]: adverse_reactions.head()
Out[252]:
                                              adverse_reaction
            given_name
                            surname
          0
                                     injection site discomfort
                 berta napolitani
                  lena
          1
                               baer
                                                  hypoglycemia
          2
                                                  hypoglycemia
                joseph
                                day
          3
                flavia fiorentino
                                                          cough
                            wubbels
               manouck
                                             throat irritation
In [253]: patients.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 503 entries, 0 to 502
Data columns (total 14 columns):
                503 non-null int64
patient_id
assigned_sex
                503 non-null object
given_name
                503 non-null object
surname
                503 non-null object
address
                491 non-null object
city
                491 non-null object
state
                491 non-null object
                491 non-null float64
zip_code
                491 non-null object
country
contact
                491 non-null object
birthdate
                503 non-null object
                503 non-null float64
weight
                503 non-null int64
height
                503 non-null float64
bmi
dtypes: float64(3), int64(2), object(9)
memory usage: 55.1+ KB
In [254]: treatments.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 280 entries, 0 to 279
```

Data columns (total 7 columns):

```
280 non-null object
given_name
                280 non-null object
surname
auralin
                280 non-null object
novodra
                280 non-null object
hba1c_start
                280 non-null float64
hba1c_end
                280 non-null float64
hba1c_change
                171 non-null float64
dtypes: float64(3), object(4)
memory usage: 15.4+ KB
In [255]: adverse_reactions.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 34 entries, 0 to 33
Data columns (total 3 columns):
given_name
                    34 non-null object
                    34 non-null object
surname
                    34 non-null object
adverse_reaction
dtypes: object(3)
memory usage: 896.0+ bytes
In [256]: all_columns = pd.Series(list(patients) + list(treatments) + list(adverse_reactions))
          all_columns[all_columns.duplicated()]
Out[256]: 14
                given_name
          15
                   surname
          21
                given_name
          22
                   surname
          dtype: object
In [257]: list(patients)
Out[257]: ['patient_id',
           'assigned_sex',
           'given_name',
           'surname',
           'address',
           'city',
           'state',
           'zip_code',
           'country',
           'contact',
           'birthdate',
           'weight',
           'height',
           'bmi']
In [258]: patients[patients['address'].isnull()]
```

Out[258]:		patient_id a	assign	ned_sex	given_na	me	surna	me add	ress	city	state	\
	209	210		female	Lali	ta E	Eldarkhan	ov	${\tt NaN}$	${\tt NaN}$	NaN	
	219	220		${\tt male}$		M	Quyn	h	${\tt NaN}$	${\tt NaN}$	${\tt NaN}$	
	230	231		female	Elisabe	th	Knuds	en	${\tt NaN}$	${\tt NaN}$	${\tt NaN}$	
	234	235		female	Marti	na	Tománko	vá	NaN	${\tt NaN}$	NaN	
	242	243		${\tt male}$	Jс	hn	O'Bri	an	${\tt NaN}$	${\tt NaN}$	${\tt NaN}$	
	249	250		${\tt male}$	Benj am	nin	Mehl	er	NaN	${\tt NaN}$	NaN	
	257	258		${\tt male}$		in	Ku	•	${\tt NaN}$		NaN	
	264	265		female	Wafiyy		Asfo		NaN	NaN	NaN	
	269	270		female	Flav		Fiorenti		NaN		NaN	
	278	279		female	Genero		Cab		NaN	NaN	NaN	
	286	287		male	Lew		We		NaN	NaN	NaN	
	296	297		female	C	h	Lâ	m	NaN	NaN	NaN	
		id	+	++	: birth	d - + -	ib+	h a i mh	+	h		
	209	zip_code com	untry NaN	NaN			weight 143.4	_		bmi 6.2		
	219	NaN	NaN	Nan			237.8			5.1		
	230	NaN	NaN	Nan			165.9			9.4		
	234	NaN	NaN	Nan			199.5			3.2		
	242	NaN	NaN	Nan			205.3			6.4		
	249	NaN	NaN	Nan			146.5			1.6		
	257	NaN	NaN	NaN			231.7			4.2		
	264	NaN	NaN	NaN			158.6			8.1		
	269	NaN	NaN	NaN			175.2			3.1		
	278	NaN	NaN	NaN			124.3			8.4		
	286	NaN	NaN	NaN		1979	155.3			3.6		
	296	NaN	NaN	NaN			181.1			2.1		
In [259]:	patie	ents describ	e()									
Out[259]:		patient_i	d	zin co	ode	weigh	nt h	eight		br	ni	
Guo[200].	count	=		91.0000		00000		00000	503	.00000		
	mean	252.00000		84.1181		43499		34195		. 48389		
	std	145.34785		265.8074		91674		11297		. 27643		
	min	1.00000		002.0000		80000		00000		. 10000		
	25%	126.50000		920.5000		30000		00000		.30000		
	50%	252.00000		57.0000		30000		00000		. 20000		
	75%	377.50000		379.0000	000 199.	50000	00 70.0	00000		.75000		
	max	503.00000	997	01.0000	000 255.	90000	79.0	00000	37	.70000	00	
T [000]			. 1 ()									
In [260]:	treat	ments.descr	1 be()									
Out[260]:		hba1c_sta	rt h	nba1c_er	nd hba1c	_char	nge					
	count	280.0000	00 28	30.00000	00 171	.0000	000					
	mean	7.9859	29	7.58928	36 C	.5460)23					
	std	0.5686	38	0.56967	72 0	.2795	555					
	min	7.5000	00	7.01000	0 0	.2000	000					
	25%	7.66000	00	7.27000	0 0	.3400	000					

0.380000

7.420000

50%

7.800000

```
In [261]: patients.sample(5)
Out[261]:
                                                                            address \
               patient_id assigned_sex given_name
                                                    surname
          144
                      145
                                   male
                                              Mile
                                                     Stani
                                                             4640 Windy Ridge Road
          34
                       35
                                 female
                                           Mariana
                                                      Souza
                                                                  577 Chipmunk Lane
          328
                      329
                                 female
                                              Anja
                                                     Hueber
                                                               3216 Lodgeville Road
          341
                      342
                                 female
                                           Fatimah
                                                     Khoury
                                                                 883 Oakwood Circle
                                   male
                                             Marek Dvoák
                                                                633 Better Street
          352
                      353
                      city state
                                   zip_code
                                                   country \
          144
                                    46804.0 United States
                Fort Wayne
                               ΙN
          34
                 Orrington
                               ME
                                     4474.0 United States
                                    55402.0 United States
          328
              Minneapolis
                              MN
          341
                 Fullerton
                               CA
                                    93632.0 United States
          352
                  Savannah
                               GΑ
                                    31401.0 United States
                                                                   birthdate weight \
                                                         contact
          144
                              260-591-5755MileStanic@dayrep.com 10/31/1961
                                                                               244.9
          34
                   207-825-8634MarianaGomesSouza@superrito.com
                                                                    3/6/1948
                                                                               152.9
          328
                       AnjaHueber@teleworm.us+1 (612) 342-6065
                                                                   4/16/1987
                                                                               151.8
          341
               FatimahAqilahKhoury@superrito.com1 949 290 0728
                                                                   1/23/1950
                                                                               120.3
          352
                              912-988-6655MarekDvorak@gustr.com
                                                                               227.7
                                                                  12/19/1966
               height
                        bmi
          144
                   71 34.2
          34
                   63 27.1
          328
                   65 25.3
                   67 18.8
          341
                   67 35.7
          352
In [262]: patients.surname.value_counts()
Out [262]: Doe
                         6
          Taylor
                         3
                         3
          Jakobsen
          Liu
                         2
          Lng
                        2
                         2
          Berg
                         2
          Batukayev
                         2
          Lund
          Johnson
                         2
                         2
          Cabrera
          Kowalczyk
                         2
          Schiavone
                         2
          Tucker
                         2
```

75%

max

Cindri

2

7.970000

9.950000

7.570000

9.580000

0.920000

0.990000

```
Gersten
                2
Kadyrov
                2
Parker
                2
Aranda
                2
                2
Correia
                2
Lâm
                2
Ogochukwu
                2
Souza
Hueber
                2
                2
Dratchev
Bùi
                2
                2
Grímsdóttir
Woniak
               2
Τ
               2
                2
Collins
                2
Nilsen
               . .
Baer
                1
                1
Lindström
Wysocki
                1
Resanovi
               1
Hill
                1
Hunter
                1
Schmitt
                1
Woodward
                1
                1
Chung
Selassie
                1
                1
Wellish
Lavrentyev
                1
Czerwinska
                1
                1
Gyenes
Chidi
                1
Vukeli
               1
Luoma
                1
Compagnon
                1
                1
Ferreira
Miller
                1
Obinna
                1
Glaser
                1
Bogolyubova
                1
MacDonald
                1
Tsukada
                1
Knutsen
                1
                1
Fournier
Piirainen
                1
Gunnarsson
                1
Scholz
                1
```

Name: surname, Length: 466, dtype: int64

In [263]:	patients.address.value_counts	()
Out[263]:	123 Main Street	6
040[200].	2778 North Avenue	2
	648 Old Dear Lane	2
	2476 Fulton Street	2
	1027 Tenmile Road	1
	846 Copperhead Road	1
	3209 Crowfield Road	1
	3613 Lodgeville Road	1
	1904 Granville Lane	1
	2970 Forest Avenue	1
	3115 May Street	1
	945 Maple Avenue	1
	4458 Stark Hollow Road	1
	2146 Willow Greene Drive	1
	2831 Milford Street	1
	3977 Jail Drive	1
	3893 Eva Pearl Street	1
	3130 Jessie Street	1
	4277 Mutton Town Road	1
	3113 Timber Ridge Road	1
	260 Derek Drive	1
	4040 Linda Street	1
	4148 Callison Lane	1
	1346 Nicholas Street	1
	2127 Elk City Road	1
	3427 Gerald L. Bates Drive	
	3411 Pyramid Valley Road	1
	631 Isaacs Creek Road	1
	323 Platinum Drive	1
	3251 Radio Park Drive	1
	ozor waaro rarn brivo	
	1257 Elsie Drive	1
	2126 Pearl Street	1
	1072 Bird Spring Lane	1
	4689 Briarhill Lane	1
	479 Elmwood Avenue	1
	3390 Hidden Meadow Drive	1
	1956 Rosemont Avenue	1
	3303 Anmoore Road	1
	115 Frank Avenue	1
	1736 Parrill Court	1
	4707 Parkway Street	1
	2121 Liberty Avenue	1
	4111 Thunder Road	1
	475 Preston Street	1
	2775 Single Street	1
	5 511610 501000	-

4220 Simpson Square	1	
3781 Hamill Avenue	1	
3434 Holt Street	1	
2645 Moore Avenue	1	
547 Weekley Street	1	
707 Gateway Avenue	1	
3094 Oral Lake Road	1	
4704 Edsel Road	1	
4243 Hidden Meadow Drive	1	
1815 Garrett Street	1	
2595 Feathers Hooves Drive	1	
149 Marion Drive	1	
3686 Meadowcrest Lane	1	
1493 Randolph Street	1	
1813 Lindale Avenue	1	
Name . addage I ab . 400		4

Name: address, Length: 483, dtype: int64

In [264]: patients[patients.address.duplicated()]

\	address	8	surname	given_name	assigned_sex	patient_id	Out[264]:
	ar Lane	648 Old Dea	Jakobsen	Jake	male	30	29
	${\tt NaN}$		Quynh	M	male	220	219
	Street	123 Main	Doe	John	male	230	229
	NaN		Knudsen	Elisabeth	female	231	230
	NaN		Tománková	Martina	female	235	234
	Street	123 Main	Doe	John	male	238	237
	NaN		O'Brian	John	male	243	242
Street NaN		123 Main	Doe	John	male	245	244
			Mehler	Benjamin	male	250	249
	Street	123 Main	Doe	John	male	252	251
	NaN		Kung	Jin	male	258	257
	NaN		Asfour	Wafiyyah	female	265	264
	NaN		Fiorentino	Flavia	female	270	269
Street		123 Main	Doe	John	male	278	277
	NaN		Cabán	Generosa	female	279	278
	Street	2476 Fulton	Taylor	Sandy	female	283	282
	NaN		Webb	Lewis	male	287	286
	${\tt NaN}$		Lâm	Ch	female	297	296
	Avenue	2778 North	Gersten	Pat	male	503	502
		\	country	zip_code	state 2	city	
			ited States	12771.0 U	New York	Port Jervis	29
			NaN	NaN	NaN	NaN	219
			ited States	12345.0 U	NY	New York	229
			NaN	NaN	NaN	NaN	230
			NaN	NaN		NaN	234
			ited States	12345.0 U	NY	New York	237
			NaN	NaN	NaN	NaN	242

```
244
         New York
                           NY
                                 12345.0
                                           United States
249
              NaN
                          NaN
                                     NaN
                                                      NaN
                                           United States
251
         New York
                           NY
                                 12345.0
257
              NaN
                          NaN
                                     NaN
                                                      {\tt NaN}
264
              NaN
                          NaN
                                     {\tt NaN}
                                                      NaN
              NaN
269
                          NaN
                                     {\tt NaN}
                                                      NaN
277
         New York
                           NY
                                 12345.0
                                           United States
278
              NaN
                          NaN
                                     NaN
282
         Rainelle
                           WV
                                 25962.0
                                           United States
286
              NaN
                          NaN
                                     {\tt NaN}
                                                      NaN
296
              NaN
                          NaN
                                     NaN
                                                      NaN
                                 68324.0
                                           United States
502
             Burr
                    Nebraska
                                                                              height \
                                             contact
                                                         birthdate
                                                                     weight
29
     JakobCJakobsen@einrot.com+1 (845) 858-7707
                                                                      155.8
                                                          8/1/1985
                                                                                   67
219
                                                          4/9/1978
                                                                      237.8
                                                                                   69
                                                  NaN
229
                      johndoe@email.com1234567890
                                                          1/1/1975
                                                                      180.0
                                                                                   72
230
                                                         9/23/1976
                                                                      165.9
                                                                                   63
                                                  NaN
234
                                                          4/7/1936
                                                                      199.5
                                                                                   65
                                                  {\tt NaN}
237
                      johndoe@email.com1234567890
                                                          1/1/1975
                                                                      180.0
                                                                                   72
242
                                                         2/25/1957
                                                                      205.3
                                                                                   74
                      johndoe@email.com1234567890
244
                                                          1/1/1975
                                                                      180.0
                                                                                   72
249
                                                  {\tt NaN}
                                                        10/30/1951
                                                                      146.5
                                                                                   69
251
                      johndoe@email.com1234567890
                                                                      180.0
                                                                                   72
                                                          1/1/1975
257
                                                  {\tt NaN}
                                                         5/17/1995
                                                                      231.7
                                                                                   69
                                                                      158.6
264
                                                         11/3/1989
                                                                                   63
                                                  NaN
269
                                                         10/9/1937
                                                                      175.2
                                                  NaN
                                                                                   61
277
                      johndoe@email.com1234567890
                                                          1/1/1975
                                                                      180.0
                                                                                   72
278
                                                        12/16/1962
                                                                      124.3
                                                                                   69
282
            304-438-2648SandraCTaylor@dayrep.com
                                                        10/23/1960
                                                                      206.1
                                                                                   64
286
                                                  NaN
                                                          4/1/1979
                                                                      155.3
                                                                                   68
296
                                                  NaN
                                                         5/14/1990
                                                                      181.1
                                                                                   63
502
            PatrickGersten@rhyta.com402-848-4923
                                                          5/3/1954
                                                                      138.2
                                                                                   71
      bmi
     24.4
29
219
     35.1
229
     24.4
230
     29.4
234
     33.2
237
     24.4
242
     26.4
244
     24.4
249
     21.6
251
     24.4
257
     34.2
264
     28.1
269
     33.1
```

```
277 24.4
           278 18.4
           282 35.4
           286 23.6
           296 32.1
           502 19.3
In [265]: patients.weight.sort_values()
Out[265]: 210
                   48.8
          459
                  102.1
          335
                  102.7
          74
                  103.2
          317
                  106.0
          171
                  106.5
           51
                  107.1
           270
                  108.1
           198
                  108.5
          48
                  109.1
          478
                  109.6
           141
                  110.2
          38
                  111.8
                  112.0
           438
           14
                  112.0
                  112.2
           235
          307
                  112.4
           191
                  112.6
           408
                  113.1
          49
                  113.3
           326
                  114.0
                  114.1
           338
                  117.0
           253
          321
                  118.4
           168
                  118.8
           1
                  118.8
          350
                  119.0
           207
                  119.2
           265
                  120.0
          341
                  120.3
                  . . .
          332
                  224.0
           252
                  224.2
           12
                  224.2
           222
                  224.8
           166
                  225.3
           111
                  225.9
           101
                  226.2
                  226.6
           150
```

```
352
                 227.7
          428
                 227.7
          88
                 227.7
          13
                 228.4
          339
                 229.0
          182
                 230.3
                 230.8
          121
                 231.7
          257
          395
                 231.9
          246
                 232.1
                 237.8
          219
          11
                 238.7
                 238.9
          50
                 239.1
          441
          499
                 239.6
          439
                 242.0
          487
                 242.4
          144
                 244.9
          61
                 244.9
          283
                 245.5
          118
                 254.5
          485
                 255.9
          Name: weight, Length: 503, dtype: float64
In [266]: weight_lbs = patients[patients.surname == 'Zaitseva'].weight * 2.20462
          height_in = patients[patients.surname == 'Zaitseva'].height
          bmi_check = 703 * weight_lbs / (height_in * height_in)
          bmi_check
Out[266]: 210
                 19.055827
          dtype: float64
In [267]: patients[patients.surname == 'Zaitseva'].bmi
Out[267]: 210
                 19.1
          Name: bmi, dtype: float64
In [268]: sum(treatments.auralin.isnull())
Out[268]: 0
In [269]: sum(treatments.novodra.isnull())
Out[269]: 0
```

Quality

patients table

- Zip code is a float not a string
- Zip code has four digits sometimes
- Tim Neudorf height is 27 in instead of 72 in
- Full state names sometimes, abbreviations other times
- Dsvid Gustafsson
- Missing demographic information (address contact columns) (can't clean)
- Erroneous datatypes (assigned sex, state, zip_code, and birthdate columns)
- Multiple phone number formats
- Default John Doe data
- Multiple records for Jakobsen, Gersten, Taylor
- kgs instead of lbs for Zaitseva weight

treatments table

- Missing HbA1c changes
- The letter 'u' in starting and ending doses for Auralin and Novodra
- Lowercase given names and surnames
- Missing records (280 instead of 350)
- Erroneous datatypes (auralin and novodra columns)
- Inaccurate HbA1c changes (leading 4s mistaken as 9s)
- Nulls represented as dashes (-) in auralin and novodra columns

adverse_reactions table

• Lowercase given names and surnames

Tidiness

- Contact column in patients table should be split into phone number and email
- Three variables in two columns in treatments table (treatment, start dose and end dose)
- Adverse reaction should be part of the treatments table
- Given name and surname columns in patients table duplicated in treatments and adverse reactions tables

0.3 Clean

0.3.1 Missing Data

Complete the following two "Missing Data" **Define, Code, and Test** sequences after watching the "Address Missing Data First" video.

treatments: Missing records (280 instead of 350)

Define Your definition here. Note: the missing treatments records are stored in a file named treatments_cut.csv, which you can see in this Jupyter Notebook's dashboard (click the jupyter logo in the top lefthand corner of this Notebook). Hint: documentation page for the function used in the solution.

Code

```
In [271]: treatments_clean = pd.concat([treatments_clean, pd.read_csv('treatments_cut.csv')], i
In [272]: treatments_clean.head()
Out [272]:
            given_name
                           surname
                                       auralin
                                                  novodra hba1c_start
                                                                        hba1c_end \
              veronika
                          jindrová 41u - 48u
                                                                   7.63
                                                                              7.20
                elliot richardson
                                                                              7.09
                                             - 40u - 45u
                                                                   7.56
          2
              yukitaka
                                             - 39u - 36u
                                                                   7.68
                                                                              7.25
                          takenaka
          3
                  skye gormanston 33u - 36u
                                                                   7.97
                                                                              7.62
                                             - 33u - 29u
                            montez
                                                                   7.78
                                                                              7.46
                alissa
             hba1c_change
          0
                      NaN
                     0.97
          1
                      {\tt NaN}
          3
                     0.35
                     0.32
```

Test

treatments: Missing HbA1c changes and Inaccurate HbA1c changes (leading 4s mistaken as 9s) Note: the "Inaccurate HbA1c changes (leading 4s mistaken as 9s)" observation, which is an accuracy issue and not a completeness issue, is included in this header because it is also fixed by the cleaning operation that fixes the missing "Missing HbA1c changes" observation. Multiple observations in one Define, Code, and Test header occurs multiple times in this notebook.

Define

• Turn hba1c_change column into a derived column |hba1c_start - hba1c_end|

Test

0.3.2 Tidiness

Complete the following four "Tidiness" **Define, Code, and Test** sequences after watching the "Cleaning for Tidiness" video.

Contact column in patients table contains two variables: phone number and email

Define Your definition here. Hint 1: use regular expressions with pandas' str.extract method. Here is an amazing regex tutorial. Hint 2: various phone number regex patterns. Hint 3: email address regex pattern, which you might need to modify to distinguish the email from the phone number.

```
In [276]: patients_clean.loc[215]
Out[276]: patient_id
                                                   216
          assigned_sex
                                                  male
          given_name
                                                  John
                                                   Doe
          surname
          address
                                       123 Main Street
                                              New York
          citv
                                                    NY
          state
                                                 12345
          zip_code
          country
                                         United States
          contact
                          johndoe@email.com1234567890
                                              1/1/1975
          birthdate
                                                   180
          weight
          height
                                                    72
          bmi
                                                  24.4
          Name: 215, dtype: object
In [277]: # Your cleaning code here
          # patients.contact.str.extract()
          # import re
          phone_reg = r'((?\d{3}.*?\d{3}.*?\d{4})'
          patients_clean['phone_number'] = patients_clean.contact.str.extract(phone_reg)
          patients_clean['phone_number'] = patients_clean.phone_number.str.strip().replace(regex)
In [278]: email_reg = r'([A-Za-z].*\.[A-Za-z]*)'
          \# email_reg = r'([A-Za-z].*)'
          patients_clean['email'] = patients_clean.contact.str.extract(email_reg)
In [279]: patients_clean = patients_clean.drop('contact', axis=1)
```

```
In [280]: patients_clean.head()
Out [280]:
             patient_id assigned_sex given_name surname
                                                                            address \
                              female
                                                 Wellish
                                                               576 Brown Bear Drive
                      2
          1
                              female
                                         Pamela
                                                    Hill 2370 University Hill Road
          2
                      3
                                                  Debord
                                                              1493 Poling Farm Road
                                male
                                            Jae
          3
                      4
                                           Liêm
                                                    Phan
                                                                2335 Webster Street
                                male
          4
                      5
                                            Tim Neudorf
                                                               1428 Turkey Pen Lane
                                male
                          city
                                     state zip_code
                                                            country birthdate weight \
             Rancho California California
                                             92390.0
                                                      United States 7/10/1976
                                                                                 121.7
          1
                     Armstrong
                                  Illinois
                                             61812.0 United States
                                                                     4/3/1967
                                                                                 118.8
          2
                          York
                                  Nebraska
                                             68467.0 United States 2/19/1980
                                                                                 177.8
                    Woodbridge
          3
                                        ΝJ
                                             7095.0 United States 7/26/1951
                                                                                 220.9
          4
                                             36303.0 United States 2/18/1928
                                                                                 192.3
                        Dothan
                                        AL
             height
                      bmi phone_number
                                                             email
         0
                 66 19.6 951-719-9170
                                          ZoeWellish@superrito.com
                 66 19.2 217-569-3204
                                              PamelaSHill@cuvox.de
                 71 24.8 402-363-6804
                                              JaeMDebord@gustr.com
          3
                 70 31.7 732-636-8246 PhanBaLiem@jourrapide.com
                                               TimNeudorf@cuvox.de
                 27 26.1 334-515-7487
  Test
In [281]: # Your testing code here
          one, _, three = list(patients_clean["phone_number"].str.len().unique())
          assert one == 12
          assert three == 10
In [282]: # Test for email
          assert patients_clean.email.shape[0] == patients_clean.phone_number.shape[0]
In [283]: assert patients_clean.shape[1] == (patients.shape[1] + 1)
```

Three variables in two columns in treatments table (treatment, start dose and end dose)

Define Your definition here. Hint: use pandas' melt function and str.split() method. Here is an excellent melt tutorial.

```
melt_prac['start'] = melt_prac.dose.apply(lambda x: x[0]).astype(int)
          melt_prac['end'] = melt_prac.dose.apply(lambda x: x[1]).astype(int)
          melt_prac = melt_prac.drop('dose', axis=1)
          melt_prac = melt_prac.reset_index(drop=True)
          treatments_clean = melt_prac
          treatments_clean.head()
Out[285]:
                           surname hba1c_start
                                                  hba1c_end hba1c_change treatment
            given_name
              veronika
                                                                     0.43
          0
                          jindrová
                                           7.63
                                                       7.20
                                                                            auralin
          1
                                           7.97
                                                       7.62
                  skye gormanston
                                                                     0.35
                                                                            auralin
          2
                sophia
                            haugen
                                           7.65
                                                       7.27
                                                                     0.38
                                                                            auralin
          3
                 eddie
                            archer
                                           7.89
                                                      7.55
                                                                     0.34
                                                                            auralin
                  asia
                           woniak
                                          7.76
                                                      7.37
                                                                    0.39
                                                                           auralin
             start end
          0
                41
                     48
          1
                33
                     36
          2
                37
                     42
          3
                31
                     38
          4
                30
                     36
```

Test

Adverse reaction should be part of the treatments table

Define Your definition here. Hint: tutorial for the function used in the solution.

merge adverse_reactions with treatments using merge

350 non-null float64

Code

hba1c_start

```
hba1c_end 350 non-null float64
hba1c_change 350 non-null float64
treatment 350 non-null object
start 350 non-null int64
end 350 non-null int64
adverse_reaction 35 non-null object
dtypes: float64(3), int64(2), object(4)
```

memory usage: 27.3+ KB

Given name and surname columns in patients table duplicated in treatments and adverse_reactions tables and Lowercase given names and surnames

Define Your definition here. Hint: tutorial for one function used in the solution and tutorial for another function used in the solution.

Code

```
In [73]: # Your cleaning code here
    Test
In [74]: # Your testing code here
```

0.3.3 Quality

Complete the remaining "Quality" **Define, Code, and Test** sequences after watching the "Cleaning for Quality" video.

Zip code is a float not a string and Zip code has four digits sometimes

Define Your definition here. Hint: see the "Data Cleaning Process" page.

Code

```
In [75]: # Your cleaning code here
    Test
In [76]: # Your testing code here
```

Tim Neudorf height is 27 in instead of 72 in

Define Your definition here.

```
In [77]: # Your cleaning code here
```

Test

```
In [78]: # Your testing code here
```

Full state names sometimes, abbreviations other times

Define Your definition here. Hint: tutorial for method used in solution.

Code

```
In [79]: # Your cleaning code here
    Test
In [80]: # Your testing code here
```

Dsvid Gustafsson

Define Your definition here.

Code

```
In [81]: # Your cleaning code here
   Test
In [82]: # Your testing code here
```

Erroneous datatypes (assigned sex, state, zip_code, and birthdate columns) and Erroneous datatypes (auralin and novodra columns) and The letter 'u' in starting and ending doses for Auralin and Novodra

Define Your definition here. Hint: documentation page for one method used in solution, documentation page for one function used in the solution, and documentation page for another method used in the solution.

Code

```
In [83]: # Your cleaning code here

Test
In [84]: # Your testing code here
```

Multiple phone number formats

Define Your definition here. Hint: helpful Stack Overflow answer.

Code

```
In [85]: # Your cleaning code here

Test
In [86]: # Your testing code here
```

Default John Doe data

Define Your definition here. Recall that it is assumed that the data that this John Doe data displaced is not recoverable.

Code

```
In [87]: # Your cleaning code here

Test
In [88]: # Your testing code here
```

Multiple records for Jakobsen, Gersten, Taylor

Define Your definition here.

Code

```
In [89]: # Your cleaning code here
```

Test

```
In [90]: # Your testing code here
```

kgs instead of lbs for Zaitseva weight

Define Your definition here.

Code

```
In [91]: # Your cleaning code here
```

Test

```
In [92]: # Your testing code here
```