As data analyst sometimes you will be given data by a company or someone to do analysis on but the data might not be organized and contains some impurities, unormalies, missing values, and so many junks, so you need to make everything right by cleaning the the whole of the data set. Before any kind analysis the data given to do analysis on must be cleaned for proper results, and the following bellow are 11 simple steps to follow in data cleaning in pandas with python; 1. Renaming of Columns 2. Re-arranging Column Order 3. Checking data types of specific columns. 4. Checking and removal of outliners 5. Removing Text from column 6. Dealing with Missing Data 7. Changing Data Types 8. Replacing Text within a column 9. String operations of column data 10. Removing Columns 11. Dropping Rows These are not the ony steps in data cleaning but it depends on how dirty your dataset is. Add yours... Pandas - Data Cleaning Let's load a new dataset on the number of fires in the Amazon rainforest Let's load a new dataset on the number of fires in the Amazon rainforest import pandas as pd from IPython.core.display import display,HTML display(HTML(""))#this will change the with of the notebook file_name = "https://raw.githubusercontent.com/rajeevratan84/datascienceforbusiness/master/amazon_fires.csv" df = pd.read_csv(file_name, encoding = "ISO-8859-1") df.tail() # How many regions are in the dataset? df['estado'].value_counts() Rio 717 Out[29]: Paraiba 478 Mato Grosso 478 alagoas 240 Acre 239 Sergipe 239 Sao Paulo 239 Santa Catarina 239 Roraima 239 rondonia 239 Piau 239 Pernambuco 239 Minas Gerais 239 pará 239 Maranhao 239 Goias 239 Espirito Santo 239 Distrito Federal 239 239 Ceara Bahia 239 Amazonas 239 239 Amapa Tocantins 239 Name: estado, dtype: int64 **Renaming Columns** In [30]: new_columns = {'ano' : 'year', 'estado': 'state', 'mes': 'month', 'numero': 'number_of_fires', 'encontro': 'date'} df.rename(columns = new_columns, inplace=True) In [31]: df.head() Out[31]: year month state number_of_fires 0 1998 Janeiro Acre 0 Fires 1/1/1998 0 Fires 1/1/1999 1 1999 Janeiro Acre 2 2000 Janeiro Acre 0 Fires 1/1/2000 3 2001 Janeiro Acre 0 Fires 1/1/2001 0 Fires 1/1/2002 4 2002 Janeiro Acre In [32]: # How many years of data do we have? df['year'].unique() array([1998, 1999, 2000, 2001, 2002, 2003, 2004, 2005, 2006, 2007, 2008, 2009, 2010, 2011, 2012, 2013, 2014, 2015, 2016, 2017], dtype=int64) # Let's explore our datetypes, we should expect number_of_types to be an integer or float datatype df.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 6454 entries, 0 to 6453 Data columns (total 5 columns): Column Non-Null Count Dtype 0 year 6454 non-null int64 6454 non-null 1 month object 6454 non-null object state number_of_fires 6322 non-null object 6454 non-null object date dtypes: int64(1), object(4) memory usage: 252.2+ KB df.head() In [34]: Out[34]: year month state number_of_fires date 0 1998 Janeiro Acre 0 Fires 1/1/1998 0 Fires 1/1/1999 **1** 1999 Janeiro Acre 2 2000 Janeiro Acre 0 Fires 1/1/2000 0 Fires 1/1/2001 3 2001 Janeiro Acre 0 Fires 1/1/2002 4 2002 Janeiro Acre Ranamin of columnn Input In [8] Ranamin of columnn **SyntaxError:** invalid syntax cd=df.rename(columns={'state':'Hamza'}) In [35]: cd Out[35]: Hamza number_of_fires 0 Fires 1/1/1998 **0** 1998 Janeiro Acre **1** 1999 0 Fires 1/1/1999 Janeiro Acre **2** 2000 Janeiro Acre 0 Fires 1/1/2000 **3** 2001 Janeiro 0 Fires 1/1/2001 Acre **4** 2002 0 Fires 1/1/2002 Janeiro Acre 128 1/1/2012 6449 2012 Dezembro Tocantins 85 1/1/2013 **6450** 2013 Dezembro Tocantins 223 1/1/2014 **6451** 2014 Dezembro Tocantins 6452 2015 Dezembro Tocantins 373 1/1/2015 **6453** 2016 Dezembro Tocantins 119 1/1/2016 6454 rows × 5 columns CHANGING THE ARRANGEMENT OF THE COL df[df.columns[[4,1,0,2,3]]].head() Out[36]: date month year state number_of_fires **0** 1/1/1998 Janeiro 1998 0 Fires Acre **1** 1/1/1999 Janeiro 1999 Acre 0 Fires **2** 1/1/2000 Janeiro 2000 0 Fires 3 1/1/2001 Janeiro 2001 Acre 0 Fires 4 1/1/2002 Janeiro 2002 Acre 0 Fires Re-arranging columns In [37]: # Columns are numbered from 0, left to right # Let's put date first, month second and year 3rd $new_order = [4,1,0,2,3,]$ df = df[df.columns[new_order]] df.head() Out[37]: date month year state number_of_fires **0** 1/1/1998 Janeiro 1998 Acre 0 Fires **1** 1/1/1999 Janeiro 1999 Acre 0 Fires **2** 1/1/2000 Janeiro 2000 0 Fires Acre **3** 1/1/2001 Janeiro 2001 Acre 0 Fires 4 1/1/2002 Janeiro 2002 Acre 0 Fires df.head(25) In [38]: Out[38]: month year state number_of_fires **0** 1/1/1998 0 Fires Janeiro 1998 Acre **1** 1/1/1999 0 Fires Janeiro 1999 Acre **2** 1/1/2000 0 Fires Janeiro 2000 Acre 3 1/1/2001 Janeiro 2001 Acre 0 Fires **4** 1/1/2002 0 Fires Janeiro 2002 Acre **5** 1/1/2003 10 Fires Janeiro 2003 Acre 6 1/1/2004 0 Fires Janeiro 2004 Acre 7 1/1/2005 Janeiro 2005 Acre 12 Fires **8** 1/1/2006 Janeiro 2006 Acre 4 Fires 9 1/1/2007 0 Fires Janeiro 2007 Acre **10** 1/1/2008 0 Fires Janeiro 2008 Acre **11** 1/1/2009 Janeiro 2009 Acre 0 Fires **12** 1/1/2010 Janeiro 2010 Acre 1 Fires **13** 1/1/2011 Janeiro 2011 Acre 0 Fires **14** 1/1/2012 0 Fires Janeiro 2012 Acre **15** 1/1/2013 Janeiro 2013 Acre 0 Fires **16** 1/1/2014 0 Fires Janeiro 2014 Acre **17** 1/1/2015 1 Fires Janeiro 2015 Acre **18** 1/1/2016 Janeiro 2016 Acre 12 Fires **19** 1/1/2017 0 Fires Janeiro 2017 Acre **20** 1/1/1998 Fevereiro 1998 Acre 0 Fires **21** 1/1/1999 Fevereiro 1999 Acre 0 Fires **22** 1/1/2000 Fevereiro 2000 Acre 0 Fires 23 1/1/2001 Fevereiro 2001 Acre 0 Fires **24** 1/1/2002 Fevereiro 2002 Acre 1 Fires df.tail() In [39] state number_of_fires Out[39]: date month year **6449** 1/1/2012 Dezembro 2012 Tocantins 128 **6450** 1/1/2013 Dezembro 2013 Tocantins 85 **6451** 1/1/2014 Dezembro 2014 Tocantins 223 **6452** 1/1/2015 Dezembro 2015 Tocantins 373 **6453** 1/1/2016 Dezembro 2016 Tocantins 119 Determing if a column contains numeric data In [40]: # It isn't, let's find our why df['number_of_fires'].str.isnumeric() False Out[40]: False False False False 6449 True 6450 True 6451 True 6452 True 6453 True Name: number_of_fires, Length: 6454, dtype: object In [41]: # We get the above error because our isdigit() returns Nan for blank or missing values # To fix this we need to convert our column datatype from non-null objects to a String df['number_of_fires'].astype(str).str.isdigit() False Out[41]: False False False False 6449 True 6450 True 6451 True 6452 True 6453 True Name: number_of_fires, Length: 6454, dtype: bool Bascially, str.isdigit only returns True for strings containing solely the digits 0-9. • By contrast, str.isnumeric returns True if it contains any numeric characters. e.g. '1/2' Removing unnecessary text from columns df['number_of_fires'].str.strip(" Fires") 0 Out[42]: 0 0 2 3 0 0 6449 128 6450 85 6451 223 6452 373 6453 119 Name: number_of_fires, Length: 6454, dtype: object Strip - Return a copy of the string with leading and trailing characters removed. If chars is omitted or None, whitespace characters are removed. If given and not None, chars must be a string; the characters in the string will be stripped from the both ends of the string this method is called on. # To replace column with cleaned column df['number_of_fires'] = df['number_of_fires'].str.strip('Fires') df.head() date month year state number_of_fires Out[48]: **0** 1/1/1998 Janeiro 1998 Acre 0 **1** 1/1/1999 Janeiro 1999 Acre 0 2 1/1/2000 Janeiro 2000 Acre 0 **3** 1/1/2001 Janeiro 2001 Acre 0 4 1/1/2002 Janeiro 2002 Acre 0 In [44]: df.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 6454 entries, 0 to 6453 Data columns (total 5 columns): # Column Non-Null Count Dtype 6454 non-null object 0 date 6454 non-null object 1 month 6454 non-null 2 int64 year 6454 non-null object state number_of_fires 6322 non-null object dtypes: int64(1), object(4) memory usage: 252.2+ KB In [53]: # We need to convert our number_of_fires column to a float data type # Also, here's an alternative string manipulation technique we can use df["number_of_fires"] = df["number_of_fires"].astype(float) df.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 6454 entries, 0 to 6453 Data columns (total 5 columns): Non-Null Count Dtype Column date 6454 non-null object 6454 non-null object 1 month 6454 non-null int64 year 6454 non-null object state number_of_fires 6322 non-null float64 dtypes: float64(1), int64(1), object(3) memory usage: 252.2+ KB # That was one way we could have handled blank data Handling missing data In [54]: # Let's reload our dataframe file_name = "https://raw.githubusercontent.com/rajeevratan84/datascienceforbusiness/master/amazon_fires.csv" df = pd.read_csv(file_name, encoding = "ISO-8859-1") new_columns = {'ano' : 'year', 'estado': 'state', 'mes': 'month', 'numero': 'number_of_fires', 'encontro': 'date'} df.rename(columns = new_columns, inplace=True) df['number_of_fires'] = df['number_of_fires'].str.strip(" Fires") # Creating a true copy of our dataframe df_copy = df.copy() df.head() date Out[54]: year month state number_of_fires 0 1/1/1998 **0** 1998 Janeiro Acre 0 1/1/1999 **1** 1999 Janeiro Acre 0 1/1/2000 2 2000 Janeiro Acre 3 2001 Janeiro 0 1/1/2001 Acre 0 1/1/2002 4 2002 Janeiro Acre In [56]: # Viewing the sum of missing values in each column df.isnull().sum() index Out[56]: year month 0 state number_of_fires 0 date 0 dtype: int64 In [55]: # We can easily remove Null or NaN (not a number) values # Drop rows with NaN values df = df.dropna() df = df.reset_index() # reset's row indexes in case any rows were dropped df.head() Out[55]: index year month state number_of_fires date 0 1/1/1998 0 1998 Janeiro Acre 1 1999 Janeiro Acre 0 1/1/1999 2 2000 Janeiro Acre 0 1/1/2000 3 2001 Janeiro 0 1/1/2001 4 2002 Janeiro Acre 0 1/1/2002 In [57]: # Let's check and see it worked df.isnull().sum() index 0 Out[57]: 0 year month 0 0 state number_of_fires 0 date dtype: int64 In [58]: # Alright so it worked, now let's reload the data and look at a few other methods of dealing with NaN or Null values # Let's reload our dataframe file_name = "https://raw.githubusercontent.com/rajeevratan84/datascienceforbusiness/master/amazon_fires.csv" df = pd.read_csv(file_name, encoding = "ISO-8859-1") new_columns = {'ano' : 'year', 'estado': 'state', 'mes': 'month', 'numero': 'number_of_fires', 'encontro': 'date'} df.rename(columns = new_columns, inplace=True) df['number_of_fires'] = df['number_of_fires'].str.strip(" Fires") df_copy = df.copy() df.head() Out[58]: year month state number_of_fires 0 1/1/1998 **0** 1998 Janeiro Acre 1 1999 Janeiro Acre 0 1/1/1999 0 1/1/2000 2 2000 Janeiro Acre 3 2001 Janeiro Acre 0 1/1/2001 4 2002 Janeiro Acre 0 1/1/2002 In [59]: # Create a boolean index for all null values d=df['number_of_fires'].isnull() False Out[59]: False 2 False 3 False False . . . 6449 False 6450 False 6451 False 6452 False 6453 False Name: number_of_fires, Length: 6454, dtype: bool df[df['number_of_fires'].isnull()].head(10) Out[60]: year month state number_of_fires **68** 2006 Abril Acre NaN 1/1/2006 **110** 2008 NaN 1/1/2008 Junho Acre **127** 2005 NaN 1/1/2005 Julho Acre **206** 2004 Novembro Acre NaN 1/1/2004 NaN 1/1/2015 **217** 2015 Novembro 444 2002 Novembro alagoas NaN 1/1/2002 NaN 1/1/2001 **522** 2001 Março Amapa **550** 2009 Abril NaN 1/1/2009 Amapa **614** 2013 Amapa NaN 1/1/2013 642 2001 Setembro Amapa NaN 1/1/2001 What do to with missing data? Remove them via .dropna(axis=0) Replace them with some arbitary number (e.g. an average) • Replace them zeros, or Forward Fill (ffill) or Back Fill (backfill) In [61]: # Using fillna with zeros df['number_of_fires'].fillna(0).head() Out[61]: 0 0 Name: number_of_fires, dtype: object In [62]: # Let's try back filling df['number_of_fires'].fillna(method='ffill').head(70) Out[62]: 65 66 67 1 68 1 69 Name: number_of_fires, Length: 70, dtype: object In [# View index 444 to see how it changes # Homework, change 444 using ffill and backfill to see how it changes bfill=df['number_of_fires'].fillna(method='backfill') bfill.iloc[444] Out[63]: df.iloc[445] # let's make the assumption that blank values are 0 fires # let's get back our copy of our original pre-processed datafrmae df = df_copy # replace all missing or NaN values with 0 df['number_of_fires'] = df['number_of_fires'].fillna(0) # Let's check to see if we did change our Nans to Os df.iloc[444] Assigning data types to our columns df.info() df["number_of_fires"] = df["number_of_fires"].str.replace('','0').astype(float) df.head() In []: df.info() df['month'].unique() Replacing text in columns In []: # Let's convert our Portuguese month names to English month_translations = {'Janeiro': 'January', 'Fevereiro': 'February', 'Março': 'March', 'Abril': 'April', 'Maio': 'May', 'Junho': 'June', 'Julho': 'July', 'Agosto': 'August', 'Setembro': 'September', 'Outubro': 'October', 'Novembro': 'November', 'Dezembro': 'December'} df["month"] = df["month"].map(month_translations) df.head() In []: base={ 'Acre': 'HAMZA', 'Alagoa':'JAARAH', 'Amapa': 'PANDO', 'Amazonas': 'TAKWA', 'Bahia':'SUNYANI', 'Ceara':'TAMALE', 'Distrito Federal': 'MALLAM', 'Espirito Santo':'JACK', 'Goias':'HFJJ', 'Maranhao': 'SANTA', 'Mato Grosso':'GOOSE', 'Minas Gerais':'GHANA', 'Pará':'GDFJFJ', 'Paraiba':'NIMA', 'Pernambuco': 'HAMRAAZ', 'Piau':'KASOA', 'Rio':'sass', 'OPE': 'CIRCLE', 'Rondonia':'RONALDO', 'Roraima': 'SALAGA', 'Santa Catarina': 'hello', 'Sao Paulo':'GEJ', 'Sergipe':'SAB', 'Tocantins':'MESSI' df["state"] = df["state"].map(base) df.head() df['state'].unique() df.isnull().sum() In []: Further string functions on columns df['state'] = df['state'].str.title() df['state'].unique() Removing columns In []: df.head() In []: # Dropping multiple columns df = df.drop("date", axis=1) # axis = 1 so that it works across our columns In []: # Let's reload the data # Let's reload our dataframe file_name = "https://raw.githubusercontent.com/rajeevratan84/datascienceforbusiness/master/amazon_fires.csv" df = pd.read_csv(file_name, encoding = "ISO-8859-1") new_columns = {'ano' : 'year', 'estado': 'state', 'mes': 'month', 'numero': 'number_of_fires', 'encontro': 'date'} df.rename(columns = new_columns, inplace=True) df['number_of_fires'] = df['number_of_fires'].str.strip(" Fires") df_copy = df.copy() df.head() In []: # Drop multiple columns df = df.drop(["year", "date"], axis=1) df.head() **Dropping Rows** Using the df.index function In []: # Let's drop the first row df = df.drop(df.index[0]) df = df.reset_index() df.head() In []: # Drop multiple rows df = df.drop(df.index[[2,3]])df.head() In []: # Drop a range of rows df = df.drop(df.index[1:4]) df.head()

Hello guys!