Day7_Start_Pandas

August 2, 2021

Day 7: Intro to Pandas

Goals for the day:

- Learn how to import & export CSVs in pandas
- First glances at the data: Head, keys, sort
- Learn how to index, add, and remove data within a dataset: (.iloc, .loc), set_index

Functions Learned:

- Make an empty data frame: pd.DataFrame()
- View top lines of a dataframe: head()
- View last lines of a dataframe: tail()
- Select data based on position: df.iloc[row,column]
- Select data based on value: .loc['value']
- Set an index: set_index()
- Sort by a specific value: sort_values()

1.Loading Pandas



1. Now we are going to use pandas. Pandas is the Python Data Analysis Library and is popular because it allows the user to manipulate and clean large amount of data.

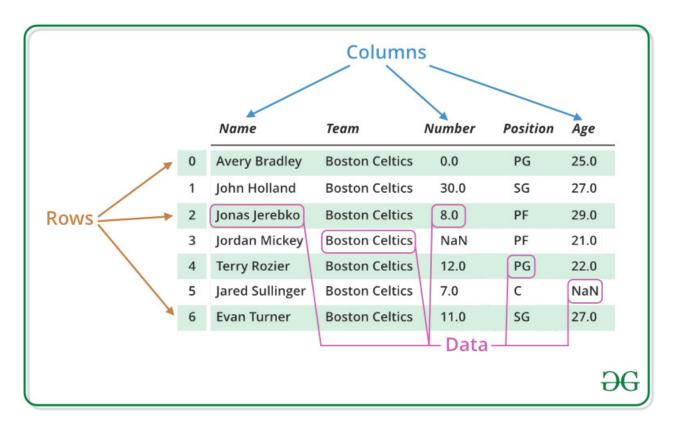
Pandas and numpy come from the SciPy library and much of the Pandas data analysis is similar to Numpy. While numpy works with numerical arrays, Pandas works with series and DataFrames that can have mixed datatypes. Pandas lets us take complicated datasets (dates, long names, missing data) and anlyze them.

You can think of it like a supercharged excel where you combine the organization of excel with the power of a programming language.

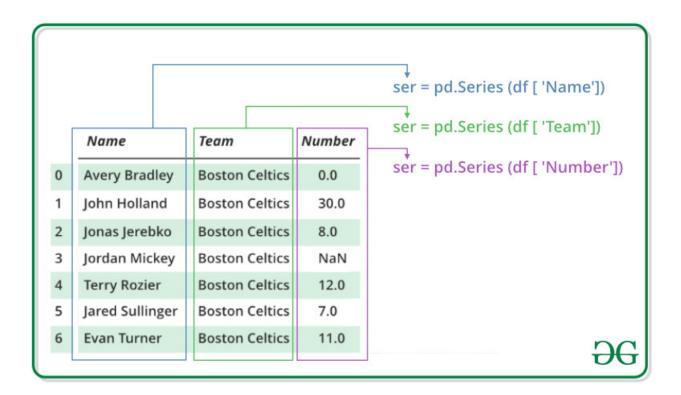
- 2. Just like we use np as a shortcut for numpy, we use pd for pandas -import pandas as pd
- 3. On a final note, you can see I made a numbered list in markdown. To do that, you type a number, a period, and then two spaces.

```
[30]: import pandas as pd import numpy as np
```

1.1 DataFrame Intro



Columns are name of series and must usually contain the same data type, when this is not the case you get into many issues.



2. DataFrame from scratch

While most of the time you will work with data that is already in a tabular format, it is important that you know how to construct a dataframe from scratch.

```
[2]: ##make an empty dataframe
my_df=pd.DataFrame()
my_df
```

[2]: Empty DataFrame
Columns: []
Index: []

Each column and row in a dataframe can be considered as a series and can be str or numeric, or, if you are evil, a mix of datatypes. So we can add columns/rows by adding series, lists, sets, you name it.

```
[3]: ## create a list with your first and last name and add this to your df
    my_info=['Maria','Hernandez']

my_df['Name']=my_info
    my_df
```

[3]: Name
0 Maria
1 Hernandez

```
[4]: ## let's add a row with my middle initail
my_df=my_df.append({'Name':'D'},ignore_index=True)
my_df
```

```
[4]: Name
0 Maria
1 Hernandez
2 D
```

In the previous cell we said to ignore the index. The index is the name pandas gives to the rows. The index always contains a unique identifier for every row. When we tell a function to ignore the index, we are ignoring the current labels and adding one more value. However, our new value will have an index and won't mess up pandas labeling.

2.1 More dataframe making tricks

```
[5]: ### make an empty frame in one step by specifing the col and index

my_df = pd.DataFrame(1,columns=['User_ID', 'UserName', 'Action'], index=['a',

→'b', 'c'])

my_df
```

```
[5]: User_ID UserName Action
a 1 1 1
b 1 1
c 1 1
```

```
[6]: ##make a dataframe using a dictionary

my_df= pd.DataFrame({'Col1':[100,200,300],'Col2':['A','B','C']})

my_df
```

```
[6]: Col1 Col2
0 100 A
1 200 B
2 300 C
```

```
## make dataframe using list

#define your lists, this will be the columns

my_list1=['Mercury','Venus','Earth']

my_list2=['hot','hot','perfect']

#call the dataframe construction

#the first item is your list zipped together as one

#the second is the index labels you want

#the third is the column names

my_df=pd.DataFrame(list(zip(my_list1, my_list2)),index =[0, 1, 2],columns_u

→=['Planet','Temp'])
```

my_df

```
[7]: Planet Temp
0 Mercury hot
1 Venus hot
2 Earth perfect
```

We will talk more about data manipulation tomorrow. You can find more info on working with empty dataframes here.

2.1 Skills practice

Make a dataframe with two columns, one column with your favorite three names and a second column with the number of letters in those names. You can use whatever method you want.

```
[8]: #### your work here ##tip: copy the code for your favorite method from above, and edit your code
```

2.1 Answer

```
[9]: ## this is my favorite method
my_new_df= pd.DataFrame({'Col1':['Gohan','Naruto','Luffy'],'Col2':[5,6,5]})
my_new_df
```

```
[9]: Col1 Col2
0 Gohan 5
1 Naruto 6
2 Luffy 5
```

3. Read in Data

3.0 Set directory: Showing Pandas where the files are

Our data files are in the folder you downloaded called data. We can tell python where that data is once so you don't have to type the path everytime.

```
[10]: #this is the specific directory where the data we want to use is stored datadirectory = '.../data/'

#this is the directory where we want to store the data we finish analyzing data_out_directory='.../output/'
```

Pandas has many built in function that we can call by doing pd.(function we want). Here is a list of functions we can use to read in (input) a document based on the kind of data you are working with. We can also save (output) new tables we create.

```
[11]: #type help(pd.read_csv) to learn more about the options #help(pd.read_csv)
```

```
#if you encounter any errors running help(pd.read_csv) rerun the following⊔
⇒command:
#import pandas as pd
```

Load Pokedex

```
[12]: #stop and make sure everyone can load the data
       #to read in a csv call read_csv from pd which looks like pd.read_csv
      pokemon_csv=pd.read_csv(datadirectory+'Pokemon.csv')
       #to see it we can call print
      print (pokemon_csv)
           Number
                                       Name
                                               Type 1
                                                        Type 2
                                                                 Total
                                                                         HP
                                                                              Attack
                                  Bulbasaur
      0
                 1
                                                 Grass
                                                        Poison
                                                                    318
                                                                         45
                                                                                  49
                 2
      1
                                    Ivysaur
                                                 Grass
                                                        Poison
                                                                    405
                                                                         60
                                                                                  62
      2
                 3
                                   Venusaur
                                                 Grass
                                                        Poison
                                                                         80
                                                                                  82
                                                                    525
      3
                 3
                    VenusaurMega Venusaur
                                                 Grass
                                                        Poison
                                                                    625
                                                                         80
                                                                                 100
      4
                 4
                                 Charmander
                                                 Fire
                                                            NaN
                                                                    309
                                                                         39
                                                                                  52
                                                   . . .
                                                            . . .
                                                                    . . .
                                                                                 . . .
               . . .
                                                                         . .
      . .
      795
               719
                                    Diancie
                                                  Rock
                                                                    600
                                                                         50
                                                                                 100
                                                         Fairy
      796
               719
                      DiancieMega Diancie
                                                 Rock
                                                         Fairy
                                                                    700
                                                                         50
                                                                                 160
      797
               720
                      HoopaHoopa Confined
                                                         Ghost
                                             Psychic
                                                                    600
                                                                         80
                                                                                 110
      798
               720
                        HoopaHoopa Unbound
                                              Psychic
                                                          Dark
                                                                                 160
                                                                    680
                                                                         80
      799
               721
                                  Volcanion
                                                 Fire
                                                         Water
                                                                    600
                                                                         80
                                                                                 110
           Defense
                     Sp. Atk Sp. Def
                                         Speed
                                                 Generation Legendary
      0
                                                                    False
                 49
                           65
                                     65
                                             45
                                                            1
                           80
      1
                 63
                                     80
                                             60
                                                            1
                                                                    False
      2
                 83
                          100
                                    100
                                             80
                                                            1
                                                                    False
      3
                123
                          122
                                    120
                                             80
                                                            1
                                                                    False
      4
                 43
                           60
                                     50
                                             65
                                                            1
                                                                    False
                . . .
                          . . .
                                    . . .
                                            . . .
                                                          . . .
      . .
      795
                150
                          100
                                    150
                                             50
                                                            6
                                                                     True
      796
                110
                          160
                                    110
                                            110
                                                            6
                                                                     True
      797
                                             70
                                                            6
                 60
                          150
                                    130
                                                                     True
      798
                 60
                          170
                                    130
                                             80
                                                            6
                                                                     True
      799
                120
                          130
                                     90
                                             70
                                                            6
                                                                     True
```

[800 rows x 13 columns]

```
[13]: #or we can just have the name alone as the last line pokemon_csv
```

```
[13]:
            Number
                                               Type 1
                                                       Type 2
                                                                Total
                                       Name
                                                                        HP
                                                                            Attack \
                 1
                                                Grass
                                                       Poison
                                                                        45
                                                                                 49
      0
                                 Bulbasaur
                                                                  318
```

1	2		Ivys	aur	Grass	Poisor	1 405	60	62
2	3		Venus	aur	Grass	Poisor	525 is	80	82
3	3	VenusaurMe	ga Venus	aur	Grass	Poisor	n 625	80	100
4	4		Charman	der	Fire	NaN	309	39	52
795	719		Dian	cie	Rock	Fairy	600	50	100
796	719	DiancieM			Rock	Fairy		50	160
797	720	НоораНоо	-		ychic	Ghost		80	110
		-	-		-				
798	720	НоораНо	opa Unbo	und Ps	ychic	Dark	c 680	80	160
799	721		Volcan	ion	Fire	Water	600	80	110
	Defense	Sp. Atk	Sp. Def	Speed	Gener	ation	Legendar	У	
0	49	65	65	45		1	Fals	е	
1	63	80	80	60		1	Fals	е	
2	83	100	100	80		1	Fals	е	
3	123	122	120	80		1	Fals	е	
4	43	60	50	65		1	Fals	е	
795	150		150	50		6	Tru	.e	
796	110	160	110	110		6	Tru	.e	
797	60	150	130	70		6	Tru	.e	
798	60	170	130	80		6	Tru	.e	
799	120	130	90	70		6	Tru	.e	

3.1 Pro-tip: How to read txt files, or files with non ',' delimeters

```
[14]: #let's try reading in the .txt file with pd.read_csv and see what happens pokemon_txt=pd.read_csv(datadirectory+'Pokemon.txt') pokemon_txt.head()
```

- [14]: Number\tName\tType 1\tType 2\tTotal\tHP\tAttack\tDefense\tSp. Atk\tSp. Def\tSpeed\tGeneration\tLegendary
 - 0 1\tBulbasaur\tGrass\tPoison\t318\t45\t49\t49\t...
 - 1 $2\t\text{Urysaur}\t\text{Grass}\t\text{Poison}\t405\t60\t62\t63\t80...$
 - 2 3\tVenusaur\tGrass\tPoison\t525\t80\t82\t83\t1...
 - 3 3\tVenusaurMega Venusaur\tGrass\tPoison\t625\t...
 - 4 4\tCharmander\tFire\t\t309\t39\t52\t43\t60\t50...

Because the delimiter (the symbol that separates data entries) is , in a csv reading a txt that is $\widehat{\text{delimited}}$ does not work. There are two ways around this:

```
[15]: # method 1, call pd.read_csv and set the delimiter to '\t' to override the ','

→ default

pokemon_txt=pd.read_csv(datadirectory+'Pokemon.txt',delimiter='\t')

pokemon_txt
```

[15]:		Number		N	ame '	Type 1	Type 2	Total	HP	Attack	\
	0	1		Bulbas	aur	Grass	Poison	318	45	49	
	1	2		Ivys	aur	Grass	Poison	405	60	62	
	2	3		Venus	aur	Grass	Poison	525	80	82	
	3	3	VenusaurM	lega Venus	aur	Grass	Poison	625	80	100	
	4	4		Charman	der	Fire	NaN	309	39	52	
	795	719		Dian	cie	Rock	Fairy	600	50	100	
	796	719	Diancie	Mega Dian	cie	Rock	Fairy	700	50	160	
	797	720	НоораНо	opa Confi	ned P	sychic	Ghost	600	80	110	
	798	720	НоораН	loopa Unbo	und P	sychic	Dark	680	80	160	
	799	721		Volcan	ion	Fire	Water	600	80	110	
		Defense	Sp. Atk	Sp. Def	Speed	Gener	ation I	egendar	У		
	0	49	65	65	45		1	Fals	е		
	1	63	80	80	60		1	Fals	е		
	2	83	100	100	80		1	Fals	е		
	3	123	122	120	80		1	Fals	е		
	4	43	60	50	65		1	Fals	е		
	795	150	100	150	50		6	Tru	.e		
	796	110	160	110	110		6	Tru	.e		
	797	60	150	130	70		6	Tru	.e		
	798	60	170	130	80		6	Tru	.e		
	799	120	130	90	70		6	Tru	.e		

[16]: #or call pd.read_table that has '\t' as the default delimeter
pokemon_txt=pd.read_table(datadirectory+'Pokemon.txt')
pokemon_txt

[16]:		Number		Name	Type 1	Type 2	Total	HP	Attack	\
	0	1		Bulbasaur	Grass	Poison	318	45	49	
	1	2		Ivysaur	Grass	Poison	405	60	62	
	2	3		Venusaur	Grass	Poison	525	80	82	
	3	3	VenusaurM	ega Venusaur	Grass	Poison	625	80	100	
	4	4		Charmander	Fire	NaN	309	39	52	
	795	719		Diancie	Rock	Fairy	600	50	100	
	796	719	Diancie	Mega Diancie	Rock	Fairy	700	50	160	
	797	720	НоораНо	opa Confined	Psychic	Ghost	600	80	110	
	798	720	НоораН	oopa Unbound	Psychic	Dark	680	80	160	
	799	721		Volcanion	Fire	Water	600	80	110	
		Defense	Sp. Atk	Sp. Def Spe	eed Gener	ation L	egendar	У		
	0	49	65	65	45	1	Fals	е		

1	63	80	80	60	1	False
2	83	100	100	80	1	False
3	123	122	120	80	1	False
4	43	60	50	65	1	False
795	150	100	150	50	6	True
796	110	160	110	110	6	True
797	60	150	130	70	6	True
798	60	170	130	80	6	True
799	120	130	90	70	6	True

3.2 Pro-tip 2: Data input options

As you may expect, the data you will work with may not always look this neat, you may have to skip rows or change delimeters. There are many ways to do that. I won't spend time discussing how to do that here but I want you to know that you can find that information in the pandas documentation.

```
[17]: ## the dataset that we are dealing with is 75KB, sometimes you'll have lots of data but you don't need it all

## redicing the data you read in will speed up pandas

# pd.info() gives you the information for each column and the total memory usage

pokemon_selected=pd.read_csv(datadirectory+'Pokemon.csv')

pokemon_selected.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 800 entries, 0 to 799
Data columns (total 13 columns):

#	Column	Non-Null Count	Dtype
0	Number	800 non-null	int64
1	Name	800 non-null	object
2	Type 1	800 non-null	object
3	Type 2	414 non-null	object
4	Total	800 non-null	int64
5	HP	800 non-null	int64
6	Attack	800 non-null	int64
7	Defense	800 non-null	int64
8	Sp. Atk	800 non-null	int64
9	Sp. Def	800 non-null	int64
10	Speed	800 non-null	int64
11	Generation	800 non-null	int64
12	Legendary	800 non-null	bool
dtyp	es: bool(1),	int64(9), object	t(3)

memory usage: 75.9+ KB

```
[18]: | ### lets call in only call the columns you may use like 'Name' and 'Speed',
      pokemon_selected=pd.read_csv(datadirectory+'Pokemon.
       →csv',usecols=['Name','Speed'])
      pokemon_selected
[18]:
                            Name
                                  Speed
      0
                       Bulbasaur
                                     45
      1
                         Ivysaur
                                     60
      2
                        Venusaur
                                     80
      3
           VenusaurMega Venusaur
                                     80
      4
                      Charmander
                                     65
                                    . . .
      795
                         Diancie
                                     50
             DiancieMega Diancie
      796
                                    110
             HoopaHoopa Confined
      797
                                     70
      798
              HoopaHoopa Unbound
                                     80
      799
                       Volcanion
                                     70
      [800 rows x 2 columns]
[19]: #this reduces the memory usage and will speed up your analysis
      pokemon_selected.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 800 entries, 0 to 799
     Data columns (total 2 columns):
          Column Non-Null Count Dtype
          _____
      0
          Name
                  800 non-null
                                  object
      1
          Speed
                  800 non-null
                                   int64
     dtypes: int64(1), object(1)
     memory usage: 12.6+ KB
[20]: ### let's only read in the first 5 rows
      pokemon_selected=pd.read_csv(datadirectory+'Pokemon.
       →csv',usecols=['Name','Speed'],nrows=5)
      pokemon_selected
[20]:
                          Name
                                Speed
      0
                     Bulbasaur
                                   45
      1
                       Ivysaur
                                   60
      2
                      Venusaur
                                   80
        VenusaurMega Venusaur
                                   80
      3
      4
                    Charmander
                                   65
```

4. Viewing the dataframe

I'm going to make a copy of the pokemon_csv with a shorter name unless you make a copy of a dataframe changes that you make will happen to your original dataframe. This is really important when we talk about indexing! Pro-tip: when making changes to your dataframe always make a copy

in python 'A.B' means that B belongs to A

View head

```
[21]: #to view top lines we use .head() notice this is also a function so this means → you have options

pokemon_df=pokemon_csv.copy()

pokemon_df.head()
```

[21]:		Number	Name	e Type 1	Type 2	Total	HP	Attack	Defense	\
	0	1	Bulbasau	r Grass	Poison	318	45	49	49	
	1	2	Ivysau	r Grass	Poison	405	60	62	63	
	2	3	Venusau	r Grass	Poison	525	80	82	83	
	3	3	VenusaurMega Venusau	r Grass	Poison	625	80	100	123	
	4	4	Charmande	r Fire	NaN	309	39	52	43	
		Sp. Atk	Sp. Def Speed Gene	eration	Legendary	7				
	0	65	65 45	1	False	į				

	bp. Ack	ph. ner	pheed	deneration	regendar A
0	65	65	45	1	False
1	80	80	60	1	False
2	100	100	80	1	False
3	122	120	80	1	False
4	60	50	65	1	False

View tail

```
[22]: # to view the last lines we use .tail()
pokemon_df.tail()
```

[22]:		Number	Name	Type 1	Type 2	Total	HP	Attack	Defense	\
	795	719	Diancie	Rock	Fairy	600	50	100	150	
	796	719	DiancieMega Diancie	Rock	Fairy	700	50	160	110	
	797	720	HoopaHoopa Confined	Psychic	Ghost	600	80	110	60	
	798	720	HoopaHoopa Unbound	Psychic	Dark	680	80	160	60	
	799	721	Volcanion	Fire	Water	600	80	110	120	

	Sp.	Atk	Sp.	Def	Speed	t	Generation	Legendary
795		100		150	50	C	6	True
796		160		110	110	C	6	True
797		150		130	70	C	6	True
798		170		130	80	C	6	True
799		130		90	70)	6	True

4.1 Skill check

I want to see the top 7 and then the bottom 3 lines

```
[23]:  ### your code here

##head

###tail
```

Answer

```
[24]: ##answer
pokemon_df.head(7)
pokemon_df.tail(3)
```

[24]:	797	Number 720	НоораНоор		ame ned	0.1	Type 2 Ghost	Total 600	HP 80	Attack 110	Defense	\
	798	720	HoopaHoo	pa Unbo	und	Psychic	Dark	680	80	160	60	
	799	721		Volcan	ion	Fire	Water	600	80	110	120	
		Sp. Atk	Sp. Def	Speed	Gen	eration	Legendar	:y				
	797	150	130	70		6	Tru	ıe				
	798	170	130	80		6	Tru	ıe				
	799	130	90	70		6	Tru	ıe				

More viewing

[25]: pokemon_df.head()

[25]:		Number	Name	Type 1	Type 2	Total	HP	Attack	Defense	\
(С	1	Bulbasaur	Grass	Poison	318	45	49	49	
-	1	2	Ivysaur	Grass	Poison	405	60	62	63	
2	2	3	Venusaur	Grass	Poison	525	80	82	83	
3	3	3	VenusaurMega Venusaur	Grass	Poison	625	80	100	123	
4	4	4	Charmander	Fire	NaN	309	39	52	43	

	Sp. Atk	Sp. Def	Speed	Generation	Legendary
0	65	65	45	1	False
1	80	80	60	1	False
2	100	100	80	1	False
3	122	120	80	1	False
4	60	50	65	1	False

view a column

```
[26]: ## can use . notation
      pokemon_df.Name
[26]: 0
                          Bulbasaur
      1
                            Ivysaur
      2
                          Venusaur
      3
             VenusaurMega Venusaur
                        Charmander
      4
      795
                            Diancie
      796
               DiancieMega Diancie
      797
               HoopaHoopa Confined
      798
                HoopaHoopa Unbound
      799
                         Volcanion
      Name: Name, Length: 800, dtype: object
[27]: ## but this gets messy when the names have symbols, like spaces
      pokemon_df.Type 1
         File "<ipython-input-27-ba86f7d208d3>", line 2
           pokemon_df.Type 1
       SyntaxError: invalid syntax
[31]: # we can use []
      pokemon_df['Type 1']
[31]: 0
               Grass
      1
               Grass
      2
               Grass
      3
               Grass
      4
                Fire
      795
                Rock
      796
                Rock
             Psychic
      797
      798
             Psychic
      799
                Fire
      Name: Type 1, Length: 800, dtype: object
[32]: ### print Attack
      print (pokemon_df['Defense'])
      print(pokemon_df['Attack'])
     0
             49
```

```
1
              63
     2
              83
     3
             123
              43
     795
             150
     796
             110
     797
              60
     798
              60
     799
             120
     Name: Defense, Length: 800, dtype: int64
     0
              49
     1
              62
     2
              82
     3
             100
     4
              52
     795
            100
     796
             160
     797
             110
             160
     798
     799
             110
     Name: Attack, Length: 800, dtype: int64
     !!Using brackets to call your columns is the cleanest way!
     get column names
[33]: #we can get the names of the colums with multiple ways
      # list(df), df.keys(), df.columns
      #print (list(pokemon_df))
      pokemon_df.columns
[33]: Index(['Number', 'Name', 'Type 1', 'Type 2', 'Total', 'HP', 'Attack',
              'Defense', 'Sp. Atk', 'Sp. Def', 'Speed', 'Generation', 'Legendary'],
            dtype='object')
     get the row or 'index' names
[34]: pokemon_df.index
[34]: RangeIndex(start=0, stop=800, step=1)
     set the index
[35]: | ##change the index to name and since we want the change in our current dataframe_
       →we use inplace=True
      pokemon_df.set_index('Name',inplace=True)
      pokemon_df.head()
```

```
Number Type 1 Type 2 Total HP Attack Defense \
      Name
      Bulbasaur
                                      Grass Poison
                                                             45
                                                                      49
                                                                               49
                                   1
                                                        318
      Ivysaur
                                   2
                                      Grass Poison
                                                        405
                                                             60
                                                                      62
                                                                               63
      Venusaur
                                     Grass Poison
                                                                      82
                                                                               83
                                   3
                                                        525
                                                             80
      VenusaurMega Venusaur
                                   3
                                     Grass Poison
                                                        625
                                                             80
                                                                     100
                                                                              123
      Charmander
                                       Fire
                                                 NaN
                                                        309
                                                             39
                                                                      52
                                                                               43
                              Sp. Atk
                                      Sp. Def
                                                 Speed
                                                        Generation Legendary
      Name
      Bulbasaur
                                   65
                                             65
                                                    45
                                                                  1
                                                                         False
      Ivysaur
                                   80
                                            80
                                                    60
                                                                  1
                                                                         False
                                  100
                                                    80
                                                                  1
      Venusaur
                                            100
                                                                         False
      VenusaurMega Venusaur
                                  122
                                            120
                                                    80
                                                                  1
                                                                         False
      Charmander
                                   60
                                            50
                                                    65
                                                                  1
                                                                         False
[36]: | ##view index
      pokemon_df.index
[36]: Index(['Bulbasaur', 'Ivysaur', 'Venusaur', 'VenusaurMega Venusaur',
              'Charmander', 'Charmeleon', 'Charizard', 'CharizardMega Charizard X',
              'CharizardMega Charizard Y', 'Squirtle',
              'Noibat', 'Noivern', 'Xerneas', 'Yveltal', 'Zygarde50% Forme',
             'Diancie', 'DiancieMega Diancie', 'HoopaHoopa Confined',
              'HoopaHoopa Unbound', 'Volcanion'],
            dtype='object', name='Name', length=800)
[37]: ### RESET the index to avoid complications later
      pokemon_df.reset_index(inplace=True)
      pokemon_df.head()
[37]:
                                 Number Type 1
                                                 Type 2
                                                                HP
                                                                             Defense
                           Name
                                                         Total
                                                                     Attack
      0
                                         Grass Poison
                                                                         49
                                                                                  49
                      Bulbasaur
                                      1
                                                           318
                                                                45
      1
                        Ivysaur
                                         Grass Poison
                                                           405
                                                                60
                                                                         62
                                                                                  63
      2
                       Venusaur
                                      3
                                         Grass Poison
                                                           525
                                                                80
                                                                         82
                                                                                  83
      3
         VenusaurMega Venusaur
                                      3
                                         Grass Poison
                                                           625
                                                                80
                                                                        100
                                                                                 123
      4
                     Charmander
                                          Fire
                                                    NaN
                                                           309
                                                                39
                                                                         52
                                                                                  43
         Sp. Atk
                  Sp. Def
                            Speed
                                  Generation
                                               Legendary
      0
                        65
                               45
                                             1
              65
                                                    False
              80
      1
                        80
                               60
                                             1
                                                    False
      2
             100
                       100
                               80
                                             1
                                                    False
                                                    False
      3
             122
                       120
                               80
                                             1
      4
              60
                        50
                               65
                                             1
                                                    False
```

[35]:

5. Selecting specific data

You can select data from a pandas dataframe by selecting rows or columns. You can also select data based on position with .iloc or with condiitons using .loc. [or a combination of both using .ix, but this is archaic and strongly discouraged in the pandas community]

Sort by numeric values

[38]:		Name	Number	Type 1	Type 2	Total	HP	Attack	Defense	Sp. Atk	\
	206	Sunkern	191	Grass	NaN	180	30	30	30	30	
	322	Azurill	298	Normal	Fairy	190	50	20	40	20	
	446	Kricketot	401	Bug	NaN	194	37	25	41	25	
	288	Wurmple	265	Bug	NaN	195	45	45	35	20	
	16	Weedle	13	Bug	Poison	195	40	35	30	20	

	Sp. Dei	Speed	Generation	Legendary
206	30	30	2	False
322	40	20	3	False
446	41	25	4	False
288	30	20	3	False
16	20	50	1	False

Sort by alphabetical order

```
[39]:
                        Name
                                       Type 1
                                                Type 2
                                                        Total
                                                                 ΗP
                                                                      Attack
                                                                              Defense \
                               Number
      794
           Zygarde50% Forme
                                                Ground
                                                           600
                                                                108
                                                                         100
                                                                                   121
                                  718
                                       Dragon
      695
                    Zweilous
                                  634
                                          Dark
                                                Dragon
                                                           420
                                                                 72
                                                                          85
                                                                                    70
```

46 631 632		Zubat Zorua Zoroark	41 570 571	Poison Dark Dark	Flying NaN NaN	245 330 510	40 40 60	45 65 105	35 40 60
	Sp. Atk	Sp. Def	Speed	Generation	on Lege	endary			
794	81	95	95		6	True			
695	65	70	58		5	False			
46	30	40	55		1	False			
631	80	40	65		5	False			
632	120	60	105		5	False			

5.0 Skill check

Sort by increasing Attack

```
[40]: | #### your code here
```

Answer

```
[41]: pokemon_df.sort_values(by='Attack', ascending=True, inplace=True)
pokemon_df.head()
```

[41]:		Name	Number	Type 1	Type 2	Total	HP	Attack	Defense	Sp. Atk	\
	488	Happiny	440	Normal	NaN	220	100	5	5	15	
	121	Chansey	113	Normal	NaN	450	250	5	5	35	
	261	Blissey	242	Normal	NaN	540	255	10	10	75	
	230	Shuckle	213	Bug	Rock	505	20	10	230	10	
	139	Magikarp	129	Water	NaN	200	20	10	55	15	

	Sp. Def	Speed	Generation	Legendary
488	65	30	4	False
121	105	50	1	False
261	135	55	2	False
230	230	5	2	False
139	20	80	1	False

5.1 Select based on position using .iloc

.iloc uses intergers, the specifc locations of the rows and columns. To select data we run df.iloc[row,column]. The values here are inclusive of the first value but exlusive of the second so 0:3, would select 0,1,2. The i in front of loc means interger, so we are indexing with the interger location.

```
[42]: #how do we see specific rows
print (pokemon_df.iloc[0,0])

pokemon_df.head()
```

Happiny

[42]:		Name	Number	Type 1 Ty	ype 2	Total	HP	Attack	Defense	Sp. Atk	\
	488	Happiny	440	Normal	NaN	220	100	5	5	15	
	121	Chansey	113	Normal	NaN	450	250	5	5	35	
	261	Blissey	242	Normal	NaN	540	255	10	10	75	
	230	Shuckle	213	Bug	Rock	505	20	10	230	10	
	139	Magikarp	129	Water	NaN	200	20	10	55	15	
		Sp. Def	Speed (Generation	Lege	ndary					
	488	65	30	4		False					
	121	105	50	1		False					
	261	135	55	2		False					
	230	230	5	2		False					
	139	20	80	1		False					

5.1 Skill Practice:

-Select rows 10-20 and columns [Name, Attack, Speed] using iloc and save as a new dataframe called 'my_selected_frame'

```
[43]: ##### answer the skill practice here
```

5.1 answer

```
[44]: ## Indexing practice
## How would you select rows 10-20 and columns [Name, Attack, Speed]

my_selected_frame=pokemon_df.iloc[10:21,[1,6,10]].copy()
my_selected_frame
```

```
[44]:
            Number
                    Attack
                              Speed
                                 40
      198
               183
                          20
      322
               298
                          20
                                 20
      189
               175
                         20
                                 20
      254
               235
                         20
                                 75
      733
               665
                         22
                                 29
      394
                         23
               360
                                 23
      484
                         24
                                 23
               436
      303
               280
                         25
                                 40
      17
                14
                          25
                                 35
      356
               325
                         25
                                 60
                         25
      187
               173
                                 15
```

```
[45]: ### frame that has rows 1,5,8, columns Name to total

my_selected_frame2=pokemon_df.iloc[[1,5,8],0:5]

my_selected_frame2
```

```
450
       121
            Chansey
                          113
                                Normal
                                            NaN
       381
             Feebas
                          349
                                            NaN
                                                    200
                                 Water
       508
            Mantyke
                          458
                                 Water Flying
                                                    345
[46]:
      ####reset index here
       pokemon_df.reset_index(inplace=True)
       pokemon_df
[46]:
                                                                                         ΗP
                                                                                              \
            index
                                          Name
                                                 Number
                                                           Type 1
                                                                       Type 2
                                                                                Total
                                                           Normal
       0
              488
                                       Happiny
                                                    440
                                                                          NaN
                                                                                  220
                                                                                        100
       1
               121
                                       Chansey
                                                           Normal
                                                                          NaN
                                                                                  450
                                                                                        250
                                                     113
       2
              261
                                                                                        255
                                       Blissey
                                                     242
                                                           Normal
                                                                          NaN
                                                                                  540
       3
              230
                                       Shuckle
                                                    213
                                                                         Rock
                                                                                  505
                                                                                         20
                                                               Bug
       4
               139
                                                     129
                                                                                  200
                                                                                         20
                                     Magikarp
                                                            Water
                                                                          NaN
               . . .
                                                               . . .
                                                                                   . . .
       795
              426
                       RayquazaMega Rayquaza
                                                    384
                                                           Dragon
                                                                       Flying
                                                                                  780
                                                                                        105
       796
              429
                          DeoxysAttack Forme
                                                    386
                                                          Psychic
                                                                          NaN
                                                                                  600
                                                                                         50
       797
              424
                       GroudonPrimal Groudon
                                                    383
                                                           Ground
                                                                         Fire
                                                                                  770
                                                                                        100
       798
              232
                    HeracrossMega Heracross
                                                    214
                                                               Bug
                                                                    Fighting
                                                                                  600
                                                                                         80
       799
               163
                         MewtwoMega Mewtwo X
                                                    150
                                                          Psychic
                                                                    Fighting
                                                                                  780
                                                                                        106
                                                            Generation
            Attack
                     Defense
                                Sp. Atk
                                          Sp. Def
                                                    Speed
                                                                          Legendary
                                                65
       0
                  5
                            5
                                      15
                                                        30
                                                                       4
                                                                               False
       1
                  5
                            5
                                     35
                                               105
                                                        50
                                                                       1
                                                                               False
       2
                           10
                                     75
                                                                       2
                 10
                                               135
                                                        55
                                                                               False
       3
                                               230
                                                         5
                                                                       2
                 10
                          230
                                      10
                                                                               False
       4
                                      15
                 10
                           55
                                                20
                                                        80
                                                                       1
                                                                               False
       . .
                . . .
                          . . .
                                    . . .
                                               . . .
                                                       . . .
                                                                     . . .
                                                                                 . . .
       795
                180
                          100
                                    180
                                               100
                                                       115
                                                                       3
                                                                                True
       796
                                                                       3
                180
                           20
                                    180
                                                20
                                                       150
                                                                                True
       797
                180
                          160
                                    150
                                                90
                                                        90
                                                                       3
                                                                                True
       798
                                                        75
                                                                       2
                                                                               False
                185
                          115
                                     40
                                               105
       799
                190
                          100
                                    154
                                               100
                                                       130
                                                                       1
                                                                                True
       [800 rows x 14 columns]
      pokemon_df=pd.read_csv(datadirectory+'Pokemon.csv')
[47]:
       pokemon_df
[47]:
            Number
                                         Name
                                                 Type 1
                                                          Type 2
                                                                   Total
                                                                           ΗP
                                                                                Attack
                                                                                         \
                                                  Grass
                  1
                                                          Poison
                                                                           45
                                                                                     49
       0
                                   Bulbasaur
                                                                      318
                  2
       1
                                                          Poison
                                                                                     62
                                      Ivysaur
                                                  Grass
                                                                      405
                                                                           60
       2
                  3
                                    Venusaur
                                                  Grass
                                                          Poison
                                                                      525
                                                                           80
                                                                                     82
                     VenusaurMega Venusaur
       3
                  3
                                                         Poison
                                                                      625
                                                                           80
                                                                                    100
                                                  Grass
       4
                  4
                                  Charmander
                                                   Fire
                                                              NaN
                                                                      309
                                                                           39
                                                                                     52
```

[45]:

Name

Number

Type 1

Type 2

Total

• •	• • •			• • •					
795	719		Dian	cie	Rock	Fair	y 600	50	100
796	719	Diancie	Mega Dian	cie	Rock	Fair	y 700	50	160
797	720	НоораНо	opa Confi	ned Ps	ychic	Ghos	t 600	80	110
798	720	HoopaH	loopa Unbo	und Ps	ychic	Darl	k 680	80	160
799	721	-	Volcan	ion	Fire	Wate	r 600	80	110
	Defense	Sp. Atk	Sp. Def	Speed	Gener	ation	Legendar	У	
0	49	65	65	45		1	Fals	е	
1	63	80	80	60		1	Fals	е	
2	83	100	100	80		1	Fals	е	
3	123	122	120	80		1	Fals	е	
4	43	60	50	65		1	Fals	е	
795	150	100	150	50		6	Tru	е	
796	110	160	110	110		6	Tru	е	
797	60	150	130	70		6	Tru	е	
798	60	170	130	80		6	Tru	е	
799	120	130	90	70		6	Tru	е	

5.2 Select based on condition using .loc

This works the same as loc in that you need to specify a row and column value. The difference is that instead of using position you specify a value.

```
[48]: ##change the index to Name so that we can refer to pokemon by name.

## This is why being able to change the index is so useful.

pokemon_by_Name=pokemon_df.set_index('Name')

#pokemon_by_Name.head()

pokemon_by_Name.loc['Pichu':'Lugia','Total':'Defense']
```

[48]:	Total	HP	Attack	Defense
Name				
Pichu	205	20	40	15
Cleffa	218	50	25	28
Igglybuff	210	90	30	15
Togepi	245	35	20	65
Togetic	405	55	40	85
Larvitar	300	50	64	50
Pupitar	410	70	84	70
Tyranitar	600	100	134	110
TyranitarMega Tyranitan	700	100	164	150

Lugia 680 106 90 130

[84 rows x 4 columns]

```
[49]: ##change the index to Name so that we can refer to pokemon by name.

## This is why being able to change the index is so useful.

## Be ready for it to not work (remeber the sorting we did)

pokemon_by_Name=pokemon_df.set_index('Name')

pokemon_by_Name.loc['Lugia':'Pichu','Total':'Defense']
```

[49]: Empty DataFrame

Columns: [Total, HP, Attack, Defense]

Index: []

We can alaso use conditional statements to select values.

ſ50l: Number Name Type 1 Type 2 Total HP Attack Defense Sp. Atk 186 172 Pichu Electric NaN205 20 40 15 35 Sp. Def Speed Generation Legendary 186 35 60 2 False

[51]: pichu=pokemon_df.loc[pokemon_df['Name'] == 'Pichu',].copy() pichu

[51]: Number Name Type 1 Type 2 Total HP Attack Defense Sp. Atk \ 186 172 Pichu Electric 205 20 40 15 35 NaN Sp. Def Speed Generation Legendary 35 False 186 60

[52]: ## view based on boolean, where legendary is true

#here we are telling pandas to select the rows where the column 'Legendary' is

→'True', and all the columns

pokemon_df.loc[pokemon_df['Legendary']==True,].head()

[52]: Number Name Type 2 Total ΗP Attack Type 1 156 144 Articuno Ice Flying 580 90 85 157 145 Zapdos Electric Flying 580 90 90

```
90
      158
               146
                                  Moltres
                                                 Fire
                                                          Flying
                                                                     580
                                                                                    100
      162
               150
                                              Psychic
                                                                     680
                                                                           106
                                                                                    110
                                   Mewtwo
                                                             NaN
      163
               150
                     MewtwoMega Mewtwo X
                                              Psychic Fighting
                                                                     780
                                                                           106
                                                                                    190
            Defense
                      Sp. Atk
                                Sp. Def
                                          Speed
                                                  Generation Legendary
                            95
                                     125
      156
                 100
                                              85
                                                            1
                                                                     True
      157
                 85
                           125
                                      90
                                            100
                                                            1
                                                                     True
                                                            1
      158
                 90
                           125
                                      85
                                              90
                                                                     True
      162
                 90
                                      90
                                                            1
                           154
                                            130
                                                                     True
      163
                 100
                           154
                                     100
                                            130
                                                            1
                                                                     True
[53]: ##select Fire or grass in Type 1
       #here we are telling pandas to select the rows where the column 'Type 1'
       →contains the words Fire or Grass, and all the columns
       # the | means 'or', while & means 'and'
      pokemon_df.loc[pokemon_df['Type 1'].str.contains('Fire|Grass'),]
[53]:
            Number
                                        Name Type 1
                                                      Type 2
                                                               Total
                                                                        ΗP
                                                                             Attack
                                                                                     \
                                              Grass
                                                      Poison
      0
                  1
                                  Bulbasaur
                                                                  318
                                                                         45
                                                                                  49
                  2
      1
                                               Grass
                                                      Poison
                                                                                  62
                                     Ivysaur
                                                                  405
                                                                        60
      2
                 3
                                   Venusaur
                                               Grass
                                                      Poison
                                                                  525
                                                                         80
                                                                                  82
      3
                                                                                100
                  3
                     VenusaurMega Venusaur
                                               Grass
                                                      Poison
                                                                  625
                                                                        80
      4
                 4
                                 Charmander
                                                Fire
                                                          NaN
                                                                  309
                                                                         39
                                                                                 52
                                         . . .
                                                 . . .
       . .
               . . .
                                                          . . .
                                                                  . . .
                                                                        . . .
                                                                                 . . .
      735
               667
                                      Litleo
                                                Fire
                                                      Normal
                                                                  369
                                                                         62
                                                                                 50
      736
               668
                                                Fire
                                                      Normal
                                                                  507
                                                                        86
                                                                                 68
                                      Pyroar
      740
               672
                                      Skiddo
                                               Grass
                                                                  350
                                                                                 65
                                                          NaN
                                                                         66
      741
               673
                                      Gogoat
                                               Grass
                                                          NaN
                                                                  531
                                                                        123
                                                                                100
      799
               721
                                  Volcanion
                                                Fire
                                                        Water
                                                                  600
                                                                         80
                                                                                110
                                                               Legendary
            Defense
                      Sp. Atk
                                Sp. Def
                                          Speed
                                                  {\tt Generation}
      0
                  49
                            65
                                      65
                                              45
                                                                    False
                                                            1
      1
                 63
                            80
                                      80
                                              60
                                                            1
                                                                    False
      2
                 83
                           100
                                     100
                                              80
                                                            1
                                                                    False
      3
                 123
                           122
                                     120
                                                            1
                                              80
                                                                    False
      4
                  43
                            60
                                      50
                                              65
                                                            1
                                                                    False
      . .
                 . . .
                           . . .
                                     . . .
                                             . . .
                                                                       . . .
                                                          . . .
      735
                  58
                           73
                                      54
                                             72
                                                            6
                                                                    False
      736
                 72
                           109
                                      66
                                             106
                                                            6
                                                                    False
      740
                                                            6
                  48
                            62
                                      57
                                              52
                                                                    False
```

[122 rows x 13 columns]

False

True

```
[54]: ## we can also select based on specifc numerical conditions
       #here we are telling pandas to select the rows where the column 'Speed' is \Box
        → greater than 50, and all the columns
      pokemon_df.loc[pokemon_df['Speed']>50,:]
[54]:
            Number
                                        Name
                                                Type 1
                                                         Type 2
                                                                  Total
                                                                           HP
                                                                                Attack
      1
                  2
                                     Ivysaur
                                                 Grass
                                                         Poison
                                                                    405
                                                                           60
                                                                                    62
      2
                  3
                                    Venusaur
                                                 Grass
                                                         Poison
                                                                    525
                                                                           80
                                                                                    82
      3
                  3
                                                                                   100
                     VenusaurMega Venusaur
                                                 Grass
                                                         Poison
                                                                    625
                                                                           80
      4
                  4
                                 Charmander
                                                  Fire
                                                            NaN
                                                                    309
                                                                           39
                                                                                    52
      5
                 5
                                 Charmeleon
                                                            NaN
                                                                    405
                                                                                    64
                                                  Fire
                                                                           58
                . . .
                                                    . . .
                                                                     . . .
                                                                          . . .
                                                                                   . . .
               718
      794
                           Zygarde50% Forme
                                                Dragon
                                                         Ground
                                                                    600
                                                                          108
                                                                                   100
      796
               719
                       DiancieMega Diancie
                                                  Rock
                                                          Fairy
                                                                    700
                                                                           50
                                                                                   160
      797
               720
                       HoopaHoopa Confined
                                               Psychic
                                                          Ghost
                                                                    600
                                                                           80
                                                                                   110
      798
                        HoopaHoopa Unbound
                                                                                   160
               720
                                               Psychic
                                                           Dark
                                                                    680
                                                                           80
      799
               721
                                  Volcanion
                                                  Fire
                                                          Water
                                                                    600
                                                                           80
                                                                                   110
            Defense
                      Sp. Atk
                                Sp. Def
                                          Speed
                                                  Generation
                                                                Legendary
      1
                  63
                            80
                                      80
                                              60
                                                             1
                                                                    False
      2
                  83
                           100
                                     100
                                              80
                                                            1
                                                                    False
      3
                 123
                           122
                                     120
                                              80
                                                            1
                                                                    False
      4
                  43
                            60
                                      50
                                              65
                                                             1
                                                                    False
      5
                  58
                            80
                                      65
                                              80
                                                             1
                                                                    False
                           . . .
                                     . . .
                                                                       . . .
      794
                 121
                            81
                                      95
                                              95
                                                            6
                                                                     True
      796
                 110
                           160
                                                             6
                                                                     True
                                     110
                                             110
      797
                  60
                           150
                                     130
                                              70
                                                             6
                                                                     True
      798
                  60
                           170
                                     130
                                              80
                                                             6
                                                                      True
      799
                 120
                           130
                                      90
                                              70
                                                             6
                                                                      True
      [537 rows x 13 columns]
[55]: | ## how would you select the data where the speed is between 2 values, (without
        \rightarrowbetween)
       ## notice I left the column section empty, when you do this pandas assumes you_{f \sqcup}
        →want all the columns
      pokemon_df.loc[((pokemon_df['Speed']>50) & (pokemon_df['Speed']<80)),]</pre>
      pokemon_df.loc[pokemon_df['Speed'].between(50,80),]
[55]:
            Number
                                        Name
                                                         Type 2
                                                                  Total
                                                                          HP
                                                                               Attack \
                                                Type 1
                  2
                                                 Grass
                                                         Poison
                                                                    405
                                                                          60
                                                                                   62
      1
                                     Ivysaur
      2
                  3
                                    Venusaur
                                                 Grass
                                                         Poison
                                                                    525
                                                                          80
                                                                                   82
                  3
      3
                     VenusaurMega Venusaur
                                                 Grass
                                                         Poison
                                                                    625
                                                                          80
                                                                                  100
```

Fire

NaN

309

39

52

Charmander

4

4

5	5		Charmel	eon	Fire	NaN	405	58	64
790	714		Noi	bat	Flying	Dragon	245	40	30
795	719		Dian	cie	Rock	Fairy	600	50	100
797	720	НоораНо	opa Confi	ned P	sychic	Ghost	600	80	110
798	720	_	loopa Unbo		sychic	Dark	680	80	160
799	721	•	Volcan		Fire	Water	600	80	110
	Defense	Sp. Atk	Sp. Def	Speed	l Gener	ation L	egendar	У	
1	63	80	80	60)	1	Fals	е	
2	83	100	100	80)	1	Fals	е	
3	123	122	120	80)	1	Fals	е	
4	43	60	50	65		1	Fals	е	
5	58	80	65	80)	1	Fals	е	
790	35	45	40	55	;	6	Fals	е	
795	150	100	150	50)	6	Tru	.e	
797	60	150	130	70)	6	Tru	.e	
798	60	170	130	80)	6	Tru	.e	
799	120	130	90	70)	6	Tru	.e	

[56]: ## what if we wanted Speed or attack over 100?
pokemon_df.loc[((pokemon_df['Speed']>100) | (pokemon_df['Attack']>100)),]

[56]:		Number			Name	Type 1	Type 2	Total	HP	Attack	\
	7	6	Charizard	Mega Char		<i>J</i> 1	Dragon	634	78	130	,
	8	6	Charizard	•			Flying	634	78	104	
	12	9		seMega Bl			NaN	630	79	103	
	19	15	Beedr	illMega E	Seedrill	Bug	Poison	495	65	150	
	22	18			Pidgeot	_	Flying	479	83	80	
	793	717			Yveltal	Dark	Flying	680	126	131	
	796	719	Dia	ncieMega	Diancie	Rock	Fairy	700	50	160	
	797	720	Ноо	раНоора С		Psychic	Ghost	600	80	110	
	798	720	Но	ораНоора	Unbound	Psychic	Dark	680	80	160	
	799	721		Vo	lcanion	Fire	Water	600	80	110	
		Defense	Sp. Atk	Sp. Def	-	Generatio	n Legen	dary.			
	7	111	130	85	100		1 F	alse			
	8	78	159	115	100		1 F	alse			
	12	120	135	115	78		1 F	alse			
	19	40	15	80	145		1 F	alse			
	22	75	70	70	101		1 F	alse			
	793	95	131	98	99		6	True			

796	110	160	110	110	6	True
797	60	150	130	70	6	True
798	60	170	130	80	6	True
799	120	130	90	70	6	True

5.2 Skill Practice:

Print the pokemons that have Attack between 90 and 120 and Type 1 contains Dark or Dragon. We only want the columns Name, Attack, Type 1. Hint: Be careful with parentheses

```
[57]: ##### answer the skill practice here
```

5.2 answer

```
[58]: #Print the pokemons that have Attack is between 20 and 100, and speed is >80, □ → and we only want their names, type, attack

pokemon_df.loc[(pokemon_df['Attack'].between(90,120) & (pokemon_df['Type 1'].str. → contains('Dark|Dragon'))),['Name','Attack','Type 1']]
```

[58]:		Name	Attack	Type 1
	233	Sneasel	95	Dark
	247	Houndoom	90	Dark
	248	HoundoomMega Houndoom	90	Dark
	285	Mightyena	90	Dark
	366	AltariaMega Altaria	110	Dragon
	407	Shelgon	95	Dragon
	418	LatiasMega Latias	100	Dragon
	419	Latios	90	Dragon
	492	Gabite	90	Dragon
	512	Weavile	120	Dark
	549	Darkrai	90	Dark
	621	Scrafty	90	Dark
	632	Zoroark	105	Dark
	672	Fraxure	117	Dragon
	682	Druddigon	120	Dragon
	696	Hydreigon	105	Dark
	706	Reshiram	120	Dragon
	712	KyuremWhite Kyurem	120	Dragon
	757	Malamar	92	Dark
	776	Goodra	100	Dragon
	794	Zygarde50% Forme	100	Dragon

BREAK

6. Making some changes to the data

The data we often work with is a starting point for our analysis and we often have to add/remove or manipulate the data.

add columns

```
[59]: ## let's add a column
      pokemon_df['test']=0
      pokemon_df.head()
[59]:
         Number
                                    Name Type 1
                                                  Type 2
                                                           Total
                                                                   ΗP
                                                                       Attack
                                                                                Defense
      0
                                           Grass
                                                  Poison
                                                             318
                                                                   45
                                                                            49
                                                                                     49
               1
                               Bulbasaur
      1
               2
                                 Ivysaur
                                           Grass Poison
                                                             405
                                                                   60
                                                                            62
                                                                                     63
      2
               3
                                Venusaur
                                           Grass Poison
                                                             525
                                                                   80
                                                                           82
                                                                                     83
      3
               3
                  VenusaurMega Venusaur
                                           Grass
                                                  Poison
                                                             625
                                                                   80
                                                                           100
                                                                                    123
      4
               4
                              Charmander
                                            Fire
                                                      NaN
                                                             309
                                                                   39
                                                                            52
                                                                                     43
         Sp. Atk
                   Sp. Def
                             Speed
                                    Generation
                                                 Legendary
                                                             test
      0
               65
                         65
                                45
                                              1
                                                      False
               80
                         80
                                60
                                              1
                                                                 0
      1
                                                      False
      2
              100
                       100
                                80
                                              1
                                                      False
                                                                 0
              122
                       120
      3
                                80
                                              1
                                                      False
                                                                 0
      4
               60
                        50
                                65
                                              1
                                                      False
                                                                 0
[60]: ## let's do some fancy column additions
      ## add a column named Boss, if attack is >100 using .loc
       #notice what happens when attack is not >100
      pokemon_df.loc[pokemon_df['Attack']>100,'Boss']=1
      pokemon_df.head()
[60]:
         Number
                                                  Type 2
                                    Name Type 1
                                                           Total
                                                                   ΗP
                                                                       Attack
                                                                                Defense
      0
               1
                               Bulbasaur
                                           Grass
                                                  Poison
                                                             318
                                                                   45
                                                                            49
                                                                                     49
               2
                                                             405
                                                                            62
      1
                                 Ivysaur
                                           Grass
                                                  Poison
                                                                   60
                                                                                     63
      2
               3
                                Venusaur
                                                             525
                                                                   80
                                                                           82
                                                                                     83
                                           Grass
                                                  Poison
      3
               3
                                                             625
                                                                   80
                                                                           100
                                                                                    123
                  VenusaurMega Venusaur
                                           Grass
                                                  Poison
      4
               4
                              Charmander
                                            Fire
                                                      NaN
                                                             309
                                                                   39
                                                                           52
                                                                                     43
                             Speed
                                    Generation
         Sp. Atk
                   Sp. Def
                                                 Legendary
                                                                    Boss
      0
               65
                         65
                                45
                                              1
                                                      False
                                                                     NaN
      1
               80
                         80
                                60
                                              1
                                                      False
                                                                 0
                                                                     NaN
      2
              100
                       100
                                80
                                              1
                                                      False
                                                                 0
                                                                     NaN
      3
              122
                       120
                                80
                                              1
                                                                 0
                                                                     NaN
                                                      False
      4
               60
                         50
                                65
                                              1
                                                      False
                                                                 0
                                                                     NaN
[61]: ## let's do some fancy column additions
      ## add a column named Boss, if attack is >100 using np.where
```

```
## notice what happend when attack is <100

pokemon_df['Boss2']=np.where(pokemon_df['Attack']>100,1,0)
pokemon_df
```

	_											
[61]:		Number		N	Tame T	Гуре 1	Type 2	Total	HP	Att	ack	\
	0	1		Bulbas	aur	Grass	Poison	318	45		49	
	1	2		Ivys	aur	Grass	Poison	405	60		62	
	2	3		Venus	aur	Grass	Poison	525	80		82	
	3	3	VenusaurM	lega Venus	aur	Grass	Poison	625	80		100	
	4	4		Charman		Fire	NaN	309	39		52	
	795	719		Dian	cie	Rock	Fairy	600	50		100	
	796	719	Diancie	Mega Dian	cie	Rock	Fairy	700	50		160	
	797	720	НоораНо	opa Confi	ned Pa	sychic	Ghost	600	80		110	
	798	720	НоораН	loopa Unbo	und Pa	sychic	Dark	680	80		160	
	799	721		Volcan	ion	Fire	Water	600	80		110	
		Defense	Sp. Atk	Sp. Def	Speed	Gener	ation I	Legendar	v t	est	Boss	\
	0	49	65	65	45	401101	1	Fals	-	0	NaN	
	1	63		80	60		1	Fals		0	NaN	
	2	83		100	80		1	False		0	NaN	
	3	123		120	80		1	False		0	NaN	
	4	43	60	50	65		1	False		0	NaN	
	795	150	100	150	50		6	Tru		0	NaN	
	796	110	160	110	110		6	True		0	1.0	
	797	60	150	130	70		6	True		0	1.0	
	798	60	170	130	80		6	Tru		0	1.0	
	799	120	130	90	70		6	Tru		0	1.0	
		Boss2										
	0	0										
	1	0										
	2	0										
	3	0										
	4	0										
	• •	• • •										
	795	0										
	796	1										
	797	1										
	798	1										
	799	1										

remove columns

```
[62]: ## lets remove the Boss column with del df[col]
      del pokemon_df['Boss']
      pokemon_df.head()
[62]:
                                                                      HP
          Number
                                      Name Type 1
                                                     Type 2
                                                              Total
                                                                          Attack
                                                                                   Defense
                1
                                Bulbasaur
                                             Grass
                                                     Poison
                                                                318
                                                                      45
                                                                               49
      0
                                                                                         49
                2
      1
                                   Ivysaur
                                             Grass
                                                     Poison
                                                                405
                                                                      60
                                                                               62
                                                                                         63
      2
                3
                                  Venusaur
                                             Grass
                                                     Poison
                                                                525
                                                                      80
                                                                               82
                                                                                         83
      3
                3
                   VenusaurMega Venusaur
                                             Grass
                                                                625
                                                                      80
                                                                              100
                                                                                        123
                                                     Poison
      4
                4
                               Charmander
                                                                309
                                                                      39
                                                                               52
                                                                                         43
                                              Fire
                                                        NaN
                              Speed
                                      {\tt Generation}
                                                    Legendary
                                                                       Boss2
          Sp. Atk
                    Sp. Def
                                                                test
      0
                65
                          65
                                  45
                                                1
                                                        False
                                                                    0
                                                                            0
                80
                                                                    0
                                                                            0
      1
                          80
                                  60
                                                1
                                                        False
      2
              100
                         100
                                  80
                                                1
                                                        False
                                                                    0
                                                                           0
      3
              122
                         120
                                  80
                                                1
                                                        False
                                                                    0
                                                                           0
      4
                60
                          50
                                  65
                                                1
                                                        False
                                                                    0
                                                                            0
      remove multiple columns
[63]: pokemon3=pokemon_df.drop(['Type 1', 'Type 2', 'Total', 'test'], axis=1)
      pokemon3.head()
[63]:
          Number
                                      Name
                                             ΗP
                                                  Attack
                                                          Defense
                                                                     Sp. Atk
                                                                               Sp. Def
                                                      49
                                                                                     65
      0
                1
                                Bulbasaur
                                             45
                                                                49
                                                                           65
                2
      1
                                                      62
                                                                63
                                                                                     80
                                   Ivysaur
                                             60
                                                                          80
      2
                3
                                                      82
                                                                83
                                  Venusaur
                                             80
                                                                          100
                                                                                    100
      3
                3
                   VenusaurMega Venusaur
                                             80
                                                     100
                                                               123
                                                                          122
                                                                                    120
      4
                               Charmander
                                                      52
                                                                43
                                                                           60
                                                                                     50
                                             39
                  Generation
          Speed
                               Legendary
      0
             45
                            1
                                    False
                                                0
      1
             60
                            1
                                    False
                                                0
      2
                            1
                                    False
                                                0
             80
      3
             80
                            1
                                    False
                                                0
      4
             65
                            1
                                                0
                                    False
[64]:
      pokemon_df
[64]:
            Number
                                                Type 1
                                                         Type 2
                                                                  Total
                                                                          HP
                                                                               Attack
                                        Name
                                                  Grass
                                                         Poison
                                                                                    49
      0
                  1
                                   Bulbasaur
                                                                     318
                                                                           45
                  2
      1
                                     Ivysaur
                                                  Grass
                                                         Poison
                                                                     405
                                                                           60
                                                                                    62
      2
                  3
                                    Venusaur
                                                  Grass
                                                         Poison
                                                                     525
                                                                          80
                                                                                    82
                     VenusaurMega Venusaur
      3
                  3
                                                  Grass
                                                         Poison
                                                                     625
                                                                          80
                                                                                   100
      4
                  4
                                  Charmander
                                                   Fire
                                                             NaN
                                                                     309
                                                                          39
                                                                                   52
                                                                     . . .
                                                                                   . . .
      795
                719
                                     Diancie
                                                   Rock
                                                           Fairy
                                                                     600
                                                                          50
                                                                                   100
```

796	719	DiancieMega Diancie			Rock	Fair	y 700	50	160
797	720	НоораНо	opa Confi	ned P	sychic	Ghos.	t 600	80	110
798	720	НоораН	loopa Unbo	ound P	sychic	Dar	k 680	80	160
799	721		Volcan	ion	Fire	Wate:	r 600	80	110
	Defense	Sp. Atk	Sp. Def	Speed	Gener	ation	Legendary	test	Boss2
0	49	65	65	45		1	False	0	0
1	63	80	80	60		1	False	0	0
2	83	100	100	80		1	False	0	0
3	123	122	120	80		1	False	0	0
4	43	60	50	65		1	False	0	0
795	150	100	150	50		6	True	0	0
796	110	160	110	110		6	True	0	1
797	60	150	130	70		6	True	0	1
798	60	170	130	80		6	True	0	1
799	120	130	90	70		6	True	0	1

remove duplicate values

[65]: ### let's remove duplicated data so that we only get one pokemon of each type 1
pokemon_df.drop_duplicates(subset=['Type 1'],keep='first', inplace=True)
pokemon_df

[65]:	Number			Name	Type 1	Type 2	Total	HP	Attack	\
0	1		Bull	oasaur	Grass	Poison	318	45	49	
4	4		Char	nander	Fire	NaN	309	39	52	
9	7		Sq	uirtle	Water	NaN	314	44	48	
13	10		Ca ⁻	terpie	Bug	NaN	195	45	30	
20	16]	Pidgey	Normal	Flying	251	40	45	
28	23			Ekans	Poison	NaN	288	35	60	
30	25		P	ikachu	Electric	NaN	320	35	55	
32	27		San	dshrew	Ground	NaN	300	50	75	
40	35		Cle	efairy	Fairy	NaN	323	70	45	
61	56		1	Mankey	Fighting	NaN	305	40	80	
68	63			Abra	Psychic	NaN	310	25	20	
80	74		Ge	eodude	Rock	Ground	300	40	80	
99	92		(Gastly	Ghost	Poison	310	30	35	
13	3 124			Jynx	Ice	Psychic	455	65	50	
15	9 147		D:	ratini	Dragon	NaN	300	41	64	
21	2 197		Uı	nbreon	Dark	NaN	525	95	65	
22	3 208		S-	teelix	Steel	Ground	510	75	85	
70	2 641	TornadusI	ncarnate	Forme	Flying	NaN	580	79	115	
	Defense	C-	Cr. Dof	Cnood	Conomoti	an Taman	dow +	+	Pogg?	
^	Defense	-	-	-	Generati	•	•	test		
0	49	65	65	45		1 F	alse	0	0	

```
4
            43
                       60
                                  50
                                          65
                                                          1
                                                                   False
                                                                               0
                                                                                       0
9
            65
                       50
                                  64
                                          43
                                                          1
                                                                   False
                                                                               0
                                                                                       0
13
            35
                       20
                                  20
                                          45
                                                          1
                                                                   False
                                                                               0
                                                                                       0
20
            40
                       35
                                  35
                                          56
                                                                   False
                                                                                       0
                                                          1
                                                                               0
28
            44
                       40
                                  54
                                          55
                                                          1
                                                                   False
                                                                               0
                                                                                       0
30
                                          90
                                                          1
                                                                   False
                                                                                       0
            40
                       50
                                  50
                                                                               0
32
            85
                       20
                                  30
                                          40
                                                          1
                                                                  False
                                                                               0
                                                                                       0
40
            48
                                                          1
                                                                   False
                                                                               0
                                                                                       0
                       60
                                  65
                                          35
                                                                                       0
61
            35
                       35
                                  45
                                          70
                                                          1
                                                                   False
                                                                               0
68
            15
                      105
                                  55
                                          90
                                                          1
                                                                   False
                                                                               0
                                                                                       0
80
           100
                       30
                                  30
                                          20
                                                          1
                                                                  False
                                                                               0
                                                                                       0
99
            30
                      100
                                  35
                                          80
                                                          1
                                                                   False
                                                                               0
                                                                                       0
133
            35
                      115
                                  95
                                          95
                                                          1
                                                                   False
                                                                               0
                                                                                       0
159
            45
                       50
                                  50
                                          50
                                                          1
                                                                   False
                                                                               0
                                                                                       0
212
           110
                       60
                                 130
                                          65
                                                          2
                                                                   False
                                                                               0
                                                                                       0
223
           200
                                                          2
                                                                                       0
                       55
                                  65
                                          30
                                                                   False
                                                                               0
                                                          5
702
            70
                                                                    True
                                                                               0
                                                                                       1
                      125
                                  80
                                         111
```

rename columns

```
[66]: ### Let's rename the total columns to 'Total_Stats'
pokemon_df.rename(columns={'Total':'Total_Stats'},inplace=True)
pokemon_df.head()
```

```
[66]:
           Number
                                 Type 1
                                          Type 2
                                                  Total_Stats
                                                                      Attack
                                                                              Defense
                                                                                        \
                          Name
                                                                 HP
      0
                1
                     Bulbasaur
                                  Grass
                                          Poison
                                                            318
                                                                 45
                                                                          49
                                                                                    49
      4
                4
                    Charmander
                                   Fire
                                             NaN
                                                            309
                                                                 39
                                                                          52
                                                                                    43
      9
                7
                      Squirtle
                                             NaN
                                                            314
                                                                 44
                                                                                    65
                                  Water
                                                                          48
                                                                 45
      13
               10
                      Caterpie
                                             NaN
                                                            195
                                                                          30
                                                                                    35
                                    Bug
                                 Normal Flying
      20
               16
                        Pidgey
                                                            251
                                                                 40
                                                                          45
                                                                                    40
                     Sp. Def
                               Speed Generation Legendary
                                                                test
                                                                       Boss2
           Sp. Atk
      0
                65
                          65
                                  45
                                                 1
                                                        False
                                                                    0
                                                                           0
      4
                60
                          50
                                  65
                                                 1
                                                        False
                                                                    0
                                                                           0
      9
                50
                          64
                                  43
                                                 1
                                                        False
                                                                    0
                                                                           0
                20
                                  45
                                                 1
                                                        False
                                                                           0
      13
                          20
                                                                    0
```

replace NaN values

```
[67]: #select the colum you want then call .fillna
pokemon_df['Type 2'].fillna(value='no type',inplace=True)
pokemon_df.head()
```

False

```
[67]:
          Number
                         Name
                                Type 1
                                          Type 2
                                                  Total_Stats
                                                                ΗP
                                                                     Attack
                                                                             Defense \
                                 Grass
                                          Poison
                                                                         49
      0
                1
                    Bulbasaur
                                                           318
                                                                45
                                                                                   49
      4
                4
                   Charmander
                                  Fire
                                        no type
                                                           309
                                                                39
                                                                         52
                                                                                   43
      9
                7
                     Squirtle
                                                           314
                                                                44
                                                                         48
                                                                                   65
                                 Water
                                         no type
```

13	10	Caterpi	e B	ug no type	19	5 45	30	35
20	16	Pidge	y Norm	al Flying	25	1 40	45	40
	Sp. Atk	Sp. Def	Speed	Generation	Legendary	test	Boss2	
0	65	65	45	1	False	0	0	
4	60	50	65	1	False	0	0	
9	50	64	43	1	False	0	0	
13	20	20	45	1	False	0	0	
20	35	35	56	1	False	0	0	

7. Export new table

```
[68]: ### let's save our table with only 1 pokemon of type 1

pokemon_unique=pokemon_df.drop_duplicates(subset=['Type 1'],keep='first')

pokemon_unique.to_csv(data_out_directory+'Pokemon_uniqueType1.csv')

pokemon_unique
```

[68]:		Number				Nar	ne	Type 1	Ty	уре 2	Total_Stats	HP	\	
	0	1			Bul	basaı	ır	Grass		oison	318			
	4	4			Char	mande	er	Fire	no	type	309	39		
	9	7			Sq	uirt.	le	Water		type	314	44		
	13	10			Ca	terp	ie	Bug	no	type	195	45		
	20	16	Pic		Pidge	еу	Normal	F	Lying	251	40			
	28	23	E		Ekar	ıs	Poison	no	type	288	35			
	30	25			Р	ikacl	nu	Electric	no	type	320	35		
	32	27			San	dshr	ew	Ground	no	type	300	50		
	40	35				efaiı	ry	Fairy	no	type	323	70		
	61	56					еу	Fighting	no	type	305	40		
	68	63				Abı	ra	Psychic	no	type	310	25		
	80	74		G		eodu	de	Rock	Gı	cound	300	40		
	99	92				Gast]	lу	Ghost	Po	oison	310	30		
	133	124				Jyı	nx	Ice	Psychic		455	65		
	159	147			D	ratin	ni	Dragon	no	type	300	41		
	212	197			U	mbre	on	Dark	no	type	525	95		
	223	208			S	teel:	ix	Steel	Gı	cound	510	75		
	702	641	Tornadus	Incai	rnate	Form	ne	Flying	no	type	580	79		
		Attack	Defense	Sp.	Atk	Sp.	Def	Speed	Gene	eration	n Legendary	tes	st	\
	0	49	49	1	65	1	65	-			l False		0	•
	4	52	43		60		50			1	l False		0	
	9	48	65		50		64				l False		0	
	13	30	35		20		20) 45			l False		0	
	20	45	40		35		35				l False		0	
	28	60	44		40		54				l False		0	
	30	55	40		50		50	90		1	l False		0	

32	75	85	20	30	40	1	False	0
40	45	48	60	65	35	1	False	0
61	80	35	35	45	70	1	False	0
68	20	15	105	55	90	1	False	0
80	80	100	30	30	20	1	False	0
99	35	30	100	35	80	1	False	0
133	50	35	115	95	95	1	False	0
159	64	45	50	50	50	1	False	0
212	65	110	60	130	65	2	False	0
223	85	200	55	65	30	2	False	0
702	115	70	125	80	111	5	True	0

	Boss2
0	0
4	0
9	0
13	0
20	0
28	0
30	0
32	0
40	0
61	0
68	0
80	0
99	0
133	0
159	0
212	0
223	0
702	1

Note: Make a thread about what kinds of plots students want to learn how to make.

Homework

- 1. Create a new variable that holds a data frame with only the data for pokemon from Generation 1 or 3 that are also Legendary and Psychic.
- 2. Export and save this table to your working folder.

Answer (2 ways)

```
[75]: ###keep in mind that I use Pandas for everything so I can do stuff in one step...

-but that

### was not always the case. It is okay to start with multiple steps until you...

-master the material

### don't feel frustrated if you don't get all this immediately
```

```
## call in my data
      pokemon_df=pd.read_csv(datadirectory+'Pokemon.csv')
      ## Remove the # in front of the line you want to run
      #answer 1 with multiple steps
      ##STEP 1: get the generations you wnat first (1)
      pokemon_df_selected_1=pokemon_df.loc[((pokemon_df['Generation']==1)_
       ##STEP 2: get the Legendary pokemon next, from the previous df (1)
      pokemon_df_selected_2=pokemon_df_selected_1.
       →loc[pokemon_df_selected_1['Legendary']==True,:].copy()
      ## STEP 3: the the Psychic next, from the previous def (2)
      pokemon_df_selected=pokemon_df_selected_2.loc[pokemon_df_selected_2['Type_
       →1']=='Psychic',:].copy()
      ###export the table, note I wrote all my answers the same so this line will work \Box
       →regardless of the method you use
      pokemon_df_selected.to_csv(data_out_directory+'pokemon_hw.csv')
      pokemon_df_selected
[75]:
           Number
                                  Name
                                         Type 1
                                                   Type 2
                                                           Total
                                                                   HP
                                                                       Attack \
      162
              150
                                Mewtwo Psychic
                                                             680
                                                                  106
                                                                          110
                                                      NaN
      163
              150
                   MewtwoMega Mewtwo X
                                        Psychic Fighting
                                                             780
                                                                  106
                                                                          190
      164
                   MewtwoMega Mewtwo Y
                                        Psychic
                                                                  106
                                                                          150
              150
                                                      NaN
                                                             780
      428
              386
                    DeoxysNormal Forme Psychic
                                                      NaN
                                                             600
                                                                   50
                                                                          150
      429
              386
                    DeoxysAttack Forme Psychic
                                                      NaN
                                                             600
                                                                   50
                                                                          180
      430
                  DeoxysDefense Forme
                                       Psychic
                                                             600
                                                                           70
              386
                                                      NaN
                                                                   50
      431
                                                             600
              386
                     DeoxysSpeed Forme
                                       Psychic
                                                      NaN
                                                                   50
                                                                           95
           Defense
                   Sp. Atk Sp. Def
                                    Speed Generation Legendary
      162
                90
                        154
                                  90
                                        130
                                                              True
                                                      1
      163
               100
                        154
                                 100
                                        130
                                                      1
                                                              True
      164
                70
                        194
                                 120
                                        140
                                                      1
                                                              True
      428
                50
                        150
                                  50
                                        150
                                                      3
                                                              True
      429
                20
                        180
                                  20
                                        150
                                                      3
                                                              True
      430
               160
                         70
                                 160
                                         90
                                                      3
                                                              True
      431
                90
                         95
                                                      3
                                  90
                                        180
                                                              True
[76]: #answer 2
      pokemon_df=pd.read_csv(datadirectory+'Pokemon.csv')
      ##one step, but A lot of ()
```

```
pokemon_df_selected_2=pokemon_df.

→loc[(((pokemon_df['Generation']==1)|(pokemon_df['Generation']==3))&((pokemon_df['Legendary']=

→True) & (pokemon_df['Type 1']=='Psychic'))),:].copy()

###export the table, note I wrote all my answers the same so this line will work_

→regardless of the method you use

pokemon_df_selected_2.to_csv(data_out_directory+'pokemon_hw_2.csv')

pokemon_df_selected_2
```

[70]			27		4 m	o	110		,
[76]:	Number		Nam	е Тур	e 1 Type		HP	Attack	\
162	150		Mewtw	o Psycl	hic Na	.N 680	106	110	
163	150	MewtwoMeg	ga Mewtwo :	X Psyc	hic Fightin	g 780	106	190	
164	150	MewtwoMeg	ga Mewtwo	Y Psyc	hic Na	N 780	106	150	
428	386	DeoxysNo	rmal Form	e Psyc	hic Na	N 600	50	150	
429	386	DeoxysAt	tack Form	e Psyc	hic Na	.N 600	50	180	
430	386	DeoxysDef	ense Form	e Psyc	hic Na	N 600	50	70	
431	386	DeoxysS	peed Form	e Psyc	hic Na	.N 600	50	95	
	Defense	Sp. Atk	Sp. Def	Speed	Generation	Legendar	у		
162	90	154	90	130	1	Tru	ıe		
163	100	154	100	130	1	Tru	ıe		
164	70	194	120	140	1	Tru	ıe		
428	50	150	50	150	3	Tru	ıe		
429	20	180	20	150	3	Tru	ıe		
430	160	70	160	90	3	Tru	ıe		
431	90	95	90	180	3	Tru			