

Class2 Data Quality, 8.16.2019

September 20, 2019

```
[7]: import pandas as pd
from pandas import DataFrame
import numpy as np
import sqlite3
import csv
import datetime
## pd.options.mode.chained_assignment = None
```

```
[8]: pip install numpy
```

Requirement already satisfied: numpy in /anaconda3/lib/python3.7/site-packages (1.16.4)

Note: you may need to restart the kernel to use updated packages.

```
[14]: a=pd.read.csv('/Users/IILSCIN/Desktop')
```

```

↳
↳-----
AttributeError                                Traceback (most recent call↳
↳last)

<ipython-input-14-1cd79278b304> in <module>
----> 1 a=pd.read.csv('/Users/IILSCIN/Desktop')

AttributeError: module 'pandas' has no attribute 'read'
```

```
[15]: import pandas as pd
import sqlite3
import csv
a=pd.read_csv('/Users/IILSCIN/Desktop/Arms_Armour_Met.csv')
a.describe()
```

```
[15]:
```

	Object ID	Period	Dynasty	Reign	Portfolio	Object Begin Date	\
count	12992.000000	0.0	0.0	0.0	0.0	12966.000000	
mean	28957.044797	NaN	NaN	NaN	NaN	1576.238624	
std	10013.946237	NaN	NaN	NaN	NaN	363.753637	
min	21810.000000	NaN	NaN	NaN	NaN	-12500.000000	
25%	25106.750000	NaN	NaN	NaN	NaN	1530.000000	
50%	28879.500000	NaN	NaN	NaN	NaN	1590.000000	
75%	32254.250000	NaN	NaN	NaN	NaN	1701.000000	
max	473912.000000	NaN	NaN	NaN	NaN	2004.000000	

	Object End Date	Geography	Type	County	Country	...	Locale	Locus	\
count	12966.000000		0.0	0.0	0.0	...	0.0	0.0	
mean	1729.686488		NaN	NaN	NaN	...	NaN	NaN	
std	281.985676		NaN	NaN	NaN	...	NaN	NaN	
min	-5000.000000		NaN	NaN	NaN	...	NaN	NaN	
25%	1609.000000		NaN	NaN	NaN	...	NaN	NaN	
50%	1800.000000		NaN	NaN	NaN	...	NaN	NaN	
75%	1900.000000		NaN	NaN	NaN	...	NaN	NaN	
max	2006.000000		NaN	NaN	NaN	...	NaN	NaN	

	Excavation	River	Rights and Reproduction	Metadata Date	Column1	\
count	0.0	0.0		0.0	1.231900e+04	0.0
mean	NaN	NaN		NaN	4.287733e+04	NaN
std	NaN	NaN		NaN	1.026679e-08	NaN
min	NaN	NaN		NaN	4.287733e+04	NaN
25%	NaN	NaN		NaN	4.287733e+04	NaN
50%	NaN	NaN		NaN	4.287733e+04	NaN
75%	NaN	NaN		NaN	4.287733e+04	NaN
max	NaN	NaN		NaN	4.287733e+04	NaN

	Column2	Column3	Column4
count	0.0	0.0	0.0
mean	NaN	NaN	NaN
std	NaN	NaN	NaN
min	NaN	NaN	NaN
25%	NaN	NaN	NaN
50%	NaN	NaN	NaN
75%	NaN	NaN	NaN
max	NaN	NaN	NaN

[8 rows x 22 columns]

```
[6]: a.describe
```

↳ -----

```
NameError                                Traceback (most recent call_
↳last)
```

```
<ipython-input-6-c3ae66b7bc8b> in <module>
----> 1 a.describe
```

```
NameError: name 'a' is not defined
```

```
[17]: a.dtypes
```

```
[17]: Object Number          object
      Is Highlight          bool
      Is Public Domain      bool
      Object ID             int64
      Department            object
      Object Name           object
      Title                 object
      Culture               object
      Period                float64
      Dynasty               float64
      Reign                 float64
      Portfolio             float64
      Artist Role           object
      Artist Prefix         object
      Artist Display Name   object
      Artist Display Bio    object
      Artist Suffix         object
      Artist Alpha Sort     object
      Artist Nationality    object
      Artist Begin Date     object
      Artist End Date       object
      Object Date           object
      Object Begin Date     float64
      Object End Date       float64
      Medium                object
      Dimensions            object
      Credit Line           object
      Geography Type        float64
      City                  object
      State                 object
      County                float64
      Country               float64
      Region                float64
      Subregion             float64
      Locale                float64
      Locus                 float64
```

```
Excavation          float64
River               float64
Classification      object
Rights and Reproduction float64
Link Resource       object
Metadata Date       float64
Repository\         object
Column1             float64
Column2             float64
Column3             float64
Column4             float64
dtype: object
```

```
[21]: a('river').drop_duplicates('river')
```

```

      □
↳ -----

TypeError                                Traceback (most recent call↳
↳ last)

<ipython-input-21-9ac5fce5158f> in <module>
----> 1 a('river').drop_duplicates('river')

TypeError: 'DataFrame' object is not callable
```

```
[16]: len(a)
```

```
[16]: 12992
```

```
[22]: len(a.columns)
```

```
[22]: 47
```

```
[23]: a.head(10)
```

```
[23]:
```

	Object Number	Is Highlight	Is Public Domain	Object ID	Department \
0	X.5	False	True	21810	Arms and Armor
1	X.11	False	True	21811	Arms and Armor
2	X.617	False	False	21812	Arms and Armor
3	14.100.448	False	False	21813	Arms and Armor
4	91.1.800	False	True	21814	Arms and Armor
5	91.1.870	False	False	21815	Arms and Armor
6	91.1.871	False	False	21816	Arms and Armor
7	91.1.872	False	False	21817	Arms and Armor
8	91.1.873	False	False	21818	Arms and Armor
9	91.1.874	False	False	21819	Arms and Armor

	Object Name \
0	Gorget
1	Blade and mounting for a sword (Katana)
2	Thumb of a left gauntlet
3	Fencing shoulder and arm guard
4	Sword guard (Tsuba)
5	Blade for a hatchet (Nata) and mounting for a ...
6	Blade and mounting for a dagger (Tant\uc0\u333)
7	Blade and mounting for double-edge dagger (Ken)
8	Mounting for a dagger (Tant\uc0\u333)
9	Blade and mounting for Dagger (Tant\uc0\u333)

	Title	Culture	Period \
0	Gorget of an Officer of the King's American Re...	Anglo-American	NaN
1	Blade and Mounting for a Sword (Katana)	Japanese	NaN
2	Thumb of a Left Gauntlet	French	NaN
3	Fencing Shoulder and Arm Guard	Japanese	NaN
4	Sword Guard (Tsuba)	Japanese	NaN
5	Blade for a Hatchet (Nata) and Mounting for a ...	Japanese	NaN
6	Blade and Mounting for a Dagger (Tant\u333)	Japanese	NaN
7	Blade and Mounting for Double-Edge Dagger (Ken)	Japanese	NaN
8	Mounting for a Dagger (Tant\u333)	Japanese	NaN
9	Blade and Mounting for Dagger (Tant\u333)	Japanese	NaN

	Dynasty	...	River	Classification Rights and Reproduction \
0	NaN	...	NaN	Armor Parts-Gorgets NaN
1	NaN	...	NaN	Swords NaN
2	NaN	...	NaN	Armor Parts-Gauntlets NaN
3	NaN	...	NaN	Fencing Equipment NaN
4	NaN	...	NaN	Sword Furniture-Tsuba NaN
5	NaN	...	NaN	Daggers NaN
6	NaN	...	NaN	Daggers NaN
7	NaN	...	NaN	Daggers NaN
8	NaN	...	NaN	Daggers NaN
9	NaN	...	NaN	Daggers NaN

	Link Resource Metadata Date \
0	http://www.metmuseum.org/art/collection/search... 42877.33341
1	http://www.metmuseum.org/art/collection/search... 42877.33341
2	http://www.metmuseum.org/art/collection/search... 42877.33341
3	http://www.metmuseum.org/art/collection/search... 42877.33341
4	http://www.metmuseum.org/art/collection/search... 42877.33341
5	http://www.metmuseum.org/art/collection/search... 42877.33341
6	http://www.metmuseum.org/art/collection/search... 42877.33341
7	http://www.metmuseum.org/art/collection/search... 42877.33341
8	http://www.metmuseum.org/art/collection/search... 42877.33341

9 <http://www.metmuseum.org/art/collection/search...> 42877.33341

	Repository\	Column1	Column2	Column3	Column4
0	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
1	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
2	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
3	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
4	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
5	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
6	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
7	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
8	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN
9	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	NaN

[10 rows x 47 columns]

[24]: a.tail(10)

[24]:	Object Number	Is Highlight	Is Public Domain	Object ID	\
	12982	2013.618	False	True	35960
	12983	36.25.5a	False	True	35961
	12984	2013.59	False	True	35962
	12985	2007.181, .182	False	True	35963
	12986	14.25.1870	False	True	436343
	12987	14.25.1878	False	True	436699
	12988	14.25.1874	False	True	436729
	12989	1984.184.1	False	True	472596
	12990	1984.184.2	False	True	472597
	12991	25.120.363	False	False	473912

	Department	Object Name	\
12982	Arms and Armor	Backplate	
12983	Arms and Armor	Helmet	
12984	Arms and Armor	Album of bit designs	
12985	Arms and Armor	Two stirrups	
12986	Arms and Armor	Painting	
12987	Arms and Armor	Painting	
12988	Arms and Armor	Painting	
12989	Arms and Armor	Shield boss	
12990	Arms and Armor	Shield boss (Umbo)	
12991	Arms and Armor	Lock with key	

	Title	\
12982	Backplate of an Armor for Vincenzo Luigi di Ca...	
12983	Ceremonial Helmet	
12984	Album of Bit Designs	
12985	Two Stirrups	
12986	Alfonso II d'Este (1533\ '961597), Duke of Ferrara	

12987	William H. Riggs (1837\'961924) in Sixteenth-C...
12988	Alfonso I d'Este (1476\'961534), Duke of Ferrara
12989	Shield Boss
12990	Shield Boss (Umbo)
12991	Lock with Key

	Culture	Period	Dynasty	...	River	\
12982	Italian, Milan	NaN	NaN	...	NaN	
12983	Chinese	NaN	NaN	...	NaN	
12984	Bohemian	NaN	NaN	...	NaN	
12985	Mongolian or Tibetan	NaN	NaN	...	NaN	
12986	Italian, Ferrara	NaN	NaN	...	NaN	
12987	French, Paris	NaN	NaN	...	NaN	
12988	Italian, Ferrara	NaN	NaN	...	NaN	
12989	Langobardic	NaN	NaN	...	NaN	
12990	Langobardic	NaN	NaN	...	NaN	
12991	French	NaN	NaN	...	NaN	

	Classification Rights and Reproduction	\
12982	Armor Parts-Backplates	NaN
12983	Armor for Man	NaN
12984	Works on Paper-Prints	NaN
12985	Equestrian Equipment-Stirrups	NaN
12986	Paintings	NaN
12987	Paintings	NaN
12988	Paintings	NaN
12989	Metalwork-Iron	NaN
12990	Metalwork-Iron	NaN
12991	Metalwork	NaN

	Link Resource	Metadata	Date	\
12982	http://www.metmuseum.org/art/collection/search...	42877.33341		
12983	http://www.metmuseum.org/art/collection/search...	42877.33341		
12984	http://www.metmuseum.org/art/collection/search...	42877.33341		
12985	http://www.metmuseum.org/art/collection/search...	42877.33341		
12986	http://www.metmuseum.org/art/collection/search...	42877.33341		
12987	http://www.metmuseum.org/art/collection/search...	42877.33341		
12988	http://www.metmuseum.org/art/collection/search...	42877.33341		
12989	http://www.metmuseum.org/art/collection/search...	42877.33341		
12990	http://www.metmuseum.org/art/collection/search...	42877.33341		
12991	http://www.metmuseum.org/art/collection/search...	42877.33341		

	Repository\	Column1	Column2	Column3	\
12982	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	
12983	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	
12984	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	
12985	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN	

12986	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN
12987	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN
12988	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN
12989	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN
12990	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN
12991	Metropolitan Museum of Art, New York, NY\	NaN	NaN	NaN

	Column4
12982	NaN
12983	NaN
12984	NaN
12985	NaN
12986	NaN
12987	NaN
12988	NaN
12989	NaN
12990	NaN
12991	NaN

[10 rows x 47 columns]

```
[25]: import statistics
```

```
[26]: a1 = a
```

```
[36]: a1_col=a[['Object ID']]
```

```
[ ]: a2_col=a[['Object ID']]
```

```
[37]: a1_col.mean()
```

```
[37]: Object ID      28957.044797
      dtype: float64
```

1

```
[39]: a1_col.median
```

```
[39]: <bound method DataFrame.median of      Object ID
0      21810
1      21811
2      21812
3      21813
4      21814
5      21815
6      21816
7      21817
8      21818
9      21819
```


10	21820
11	21821
12	21822
13	21823
14	21824
15	21825
16	21826
17	21827
18	21828
19	21829
20	21830
21	21831
22	21832
23	21833
24	21834
25	21835
26	21836
27	21837
28	21839
29	21840
...	...
12962	35934
12963	35935
12964	35936
12965	35937
12966	35938
12967	35939
12968	35942
12969	35944
12970	35945
12971	35947
12972	35948
12973	35949
12974	35952
12975	35953
12976	35954
12977	35955
12978	35956
12979	35957
12980	35958
12981	35959
12982	35960
12983	35961
12984	35962
12985	35963
12986	436343
12987	436699

```
12988    436729
12989    472596
12990    472597
12991    473912
```

```
[12992 rows x 1 columns]>
```

1.1

1.2

```
[40]: a2 = [['Culture', 'Object ID']]
```

```
[42]: a2
```

```
[42]: [['Culture', 'Object ID']]
```

```
[45]: a2 = a1[['Culture', 'Object ID']]
```

1.3

```
[46]: a2.head(10)
```

```
[46]:
```

	Culture	Object ID
0	Anglo-American	21810
1	Japanese	21811
2	French	21812
3	Japanese	21813
4	Japanese	21814
5	Japanese	21815
6	Japanese	21816
7	Japanese	21817
8	Japanese	21818
9	Japanese	21819

```
[47]: a2.groupby(['Object ID']).size()
```

```
[47]:
```

Object ID	
21810	1
21811	1
21812	1
21813	1
21814	1
21815	1
21816	1
21817	1
21818	1
21819	1
21820	1
21821	1

21822	1
21823	1
21824	1
21825	1
21826	1
21827	1
21828	1
21829	1
21830	1
21831	1
21832	1
21833	1
21834	1
21835	1
21836	1
21837	1
21839	1
21840	1
..	
35934	1
35935	1
35936	1
35937	1
35938	1
35939	1
35942	1
35944	1
35945	1
35947	1
35948	1
35949	1
35952	1
35953	1
35954	1
35955	1
35956	1
35957	1
35958	1
35959	1
35960	1
35961	1
35962	1
35963	1
436343	1
436699	1
436729	1
472596	1

```
472597    1
473912    1
Length: 12992, dtype: int64
```

1.4

```
[48]: a2.isnull().sum()
```

```
[48]: Culture      25
      Object ID    0
      dtype: int64
```

```
[49]: a1.isnull().sum()
```

```
[49]: Object Number      0
      Is Highlight      0
      Is Public Domain  0
      Object ID         0
      Department        0
      Object Name        0
      Title             13
      Culture           25
      Period            12992
      Dynasty           12992
      Reign             12992
      Portfolio         12992
      Artist Role       12271
      Artist Prefix     12692
      Artist Display Name 12271
      Artist Display Bio 12289
      Artist Suffix     12976
      Artist Alpha Sort  12271
      Artist Nationality 12351
      Artist Begin Date  12333
      Artist End Date    12323
      Object Date        32
      Object Begin Date  26
      Object End Date    26
      Medium             473
      Dimensions        952
      Credit Line        450
      Geography Type     12992
      City              11920
      State             12111
      County            12992
      Country           12992
      Region            12992
      Subregion         12992
```

Locale	12992
Locus	12992
Excavation	12992
River	12992
Classification	673
Rights and Reproduction	12992
Link Resource	673
Metadata Date	673
Repository\	673
Column1	12992
Column2	12992
Column3	12992
Column4	12992

dtype: int64

```
[ ]: a2['yr']=
```