# Lecture 9: Pandas

The Python library, not the cute Chinese bear

#### Import statements

```
import pandas
import pandas as pd
from pandas import DataFrame

pandas.DataFrame
pd.DataFrame
DataFrame
```

#### Import statements

```
import pandas
import pandas as pd
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pandas.DataFrame
pd.DataFrame
DataFrame
DataFrame
```

#### Import statements

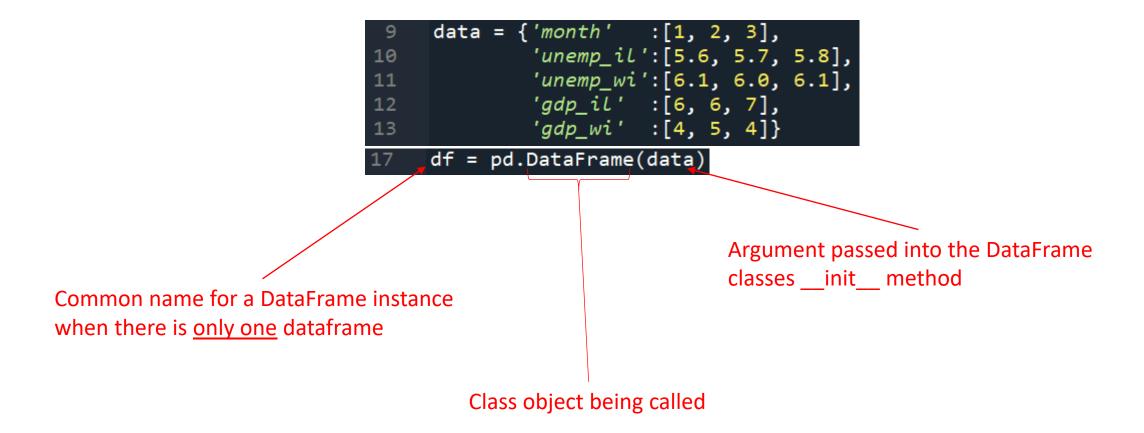
Correct by convention

```
import pandas
import pandas as pd
from pandas import DataFrame

pandas.DataFrame
pd.DataFrame
DataFrame
```

#### Our first DataFrame

#### Our first DataFrame



#### Our first DataFrame

```
In [12]: df
Out[12]:
   month unemp_il unemp_wi gdp_il gdp_wi
0   1   5.6   6.1   6   4
1   2   5.7   6.0   6   5
2   3   5.8   6.1   7   4
```

# Anatomy of a DataFrame

|   |       |          |          |        |        | Column names |
|---|-------|----------|----------|--------|--------|--------------|
|   | month | unemp_il | unemp_wi | gdp_il | gdp_wi |              |
| 0 | 1     | 5.6      | 6.1      | 6      | 4      |              |
| 1 | 2     | 5.7      | 6.0      | 6      | 5      |              |
| 2 | 3     | 5.8      | 6.1      | 7      | 4      |              |
|   |       |          |          |        |        |              |

Index names -

## Subsetting a dataframe

- Select by column
- Select by index (row)
- Select by column and index
- Select by conditionals

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        0
        1
        5.6
        6.1
        6
        4

        1
        2
        5.7
        6.0
        6
        5

        2
        3
        5.8
        6.1
        7
        4
```

```
In [13]: df['month']
Out[13]:
0    1
1    2
2    3
Name: month, dtype: int64
```

```
In [14]: df[['unemp_il', 'gdp_il']]
Out[14]:
   unemp_il gdp_il
0    5.6    6
1    5.7    6
2    5.8    7
```

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        0
        1
        5.6
        6.1
        6
        4

        1
        2
        5.7
        6.0
        6
        5

        2
        3
        5.8
        6.1
        7
        4
```

Why the double-square-brackets?

```
In [13]: df['month']
Out[13]:
0    1
1    2
2    3
Name: month, dtype: int64
```

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        0
        1
        5.6
        6.1
        6
        4

        1
        2
        5.7
        6.0
        6
        5

        2
        3
        5.8
        6.1
        7
        4
```

Selecting one column takes a string, but selecting multiple is done with a list

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        0
        1
        5.6
        6.1
        6
        4

        1
        2
        5.7
        6.0
        6
        5

        2
        3
        5.8
        6.1
        7
        4
```

Can be a good spot for a list comprehension

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        0
        1
        5.6
        6.1
        6
        4

        1
        2
        5.7
        6.0
        6
        5

        2
        3
        5.8
        6.1
        7
        4
```

DataFrame instances have a "columns" value that we can iterate over

Can be a good spot for a list comprehension

#### Applying operations over columns

|   | month | unemp_il | unemp_wi | gdp_il | gdp_wi |
|---|-------|----------|----------|--------|--------|
| 0 | 1     | 5.6      | 6.1      | 6      | 4      |
| 1 | 2     | 5.7      | 6.0      | 6      | 5      |
| 2 | 3     | 5.8      | 6.1      | 7      | 4      |

We can apply nearly any function that takes a list-like object to a column

#### Applying operations over columns

|   | month | unemp_il | unemp_wi | gdp_il | gdp_wi |
|---|-------|----------|----------|--------|--------|
| 0 | 1     | 5.6      | 6.1      | 6      | 4      |
| 1 | 2     | 5.7      | 6.0      | 6      | 5      |
| 2 | 3     | 5.8      | 6.1      | 7      | 4      |

We can apply nearly any **function** that takes a list-like object to a column

But in most cases
DataFrames also have
their own **methods** 

```
In [18]: df['unemp_il'].mean()
Out[18]: 5.7
```

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        0
        1
        5.6
        6.1
        6
        4

        1
        2
        5.7
        6.0
        6
        5

        2
        3
        5.8
        6.1
        7
        4
```

Same slicing notation as with lists

```
In [19]: df[1:]
Out[19]:
   month unemp_il unemp_wi gdp_il gdp_wi
1   2   5.7   6.0   6   5
2   3   5.8   6.1   7   4
```

```
In [21]: df.index = ['a', 'b', 'c']
...: df
Out[21]:
month unemp_il unemp_wi gdp_il gdp_wi

a 1 5.6 6.1 6 4
b 2 5.7 6.0 6 5
c 3 5.8 6.1 7 4
```

Using the ".loc" method for row *names* 

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        a
        1
        5.6
        6.1
        6
        4

        b
        2
        5.7
        6.0
        6
        5

        c
        3
        5.8
        6.1
        7
        4
```

```
In [23]: df.loc[['a', 'c']]
Out[23]:
   month unemp_il unemp_wi gdp_il gdp_wi
a     1     5.6     6.1     6     4
c     3     5.8     6.1     7     4
```

#### Using the ".iloc" method for row **positions**

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        a
        1
        5.6
        6.1
        6
        4

        b
        2
        5.7
        6.0
        6
        5

        c
        3
        5.8
        6.1
        7
        4
```

```
In [25]: df.iloc[[0, 2]]
Out[25]:
   month unemp_il unemp_wi gdp_il gdp_wi
a    1    5.6    6.1    6    4
c    3    5.8    6.1    7    4
```

#### Selecting by rows and columns

```
        month
        unemp_il
        unemp_wi
        gdp_il
        gdp_wi

        a
        1
        5.6
        6.1
        6
        4

        b
        2
        5.7
        6.0
        6
        5

        c
        3
        5.8
        6.1
        7
        4
```

Using ".loc" to select by row names and column names

```
In [26]: df.loc[['a', 'c'], ['unemp_il', 'gdp_il']]
Out[26]:
    unemp_il gdp_il
a     5.6     6
c     5.8     7
```

Using ".iloc" to select by row positions and column positions

```
In [27]: df.iloc[[0, 2], [1, 3]]
Out[27]:
   unemp_il gdp_il
a     5.6     6
c     5.8     7
```

Rows first, columns second

```
In [35]: df1 = df[['unemp_il', 'unemp_wi']]
    ...: df1
Out[35]:
    unemp_il unemp_wi
a     5.6     6.1
b     5.7     6.0
c     5.8     6.1
```

Notation for "all", in this case rows

```
In [36]: df2 = df.loc[:, ['unemp_il', 'unemp_wi']]
    ...: df2
Out[36]:
    unemp_il unemp_wi
a     5.6     6.1
b     5.7     6.0
c     5.8     6.1
```

#### View vs Full Copy

```
In [38]: df1['il_rescaled'] = df1['unemp_il'] * .01
    __main__:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

In [39]: df2['il_rescaled'] = df2['unemp_il'] * .01
```

#### View vs Full Copy

```
In [38]: df1['il_rescaled'] = df1['unemp_il'] * .01
    __main__:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
In [39]: df2['il_rescaled'] = df2['unemp_il'] * .01
```

df1 created with [] notation passing a list df2 created with the .loc method

df1 is a view df2 is a full copy

#### View vs Full Copy

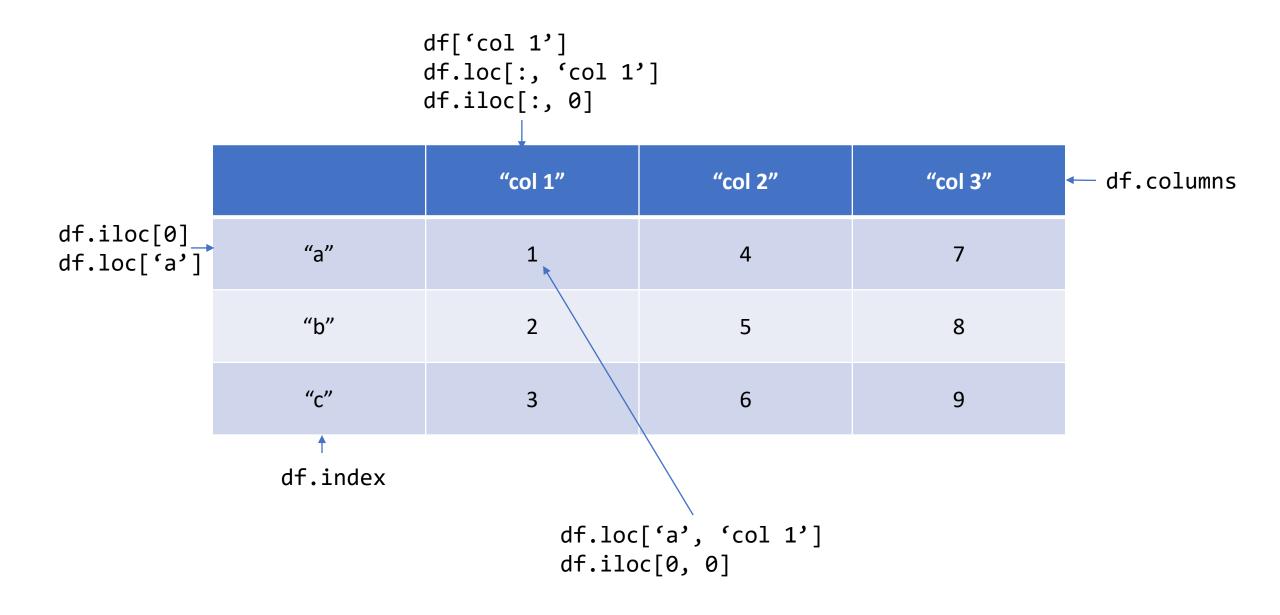
```
In [38]: df1['il_rescaled'] = df1['unemp_il'] * .01
    __main__:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

In [39]: df2['il_rescaled'] = df2['unemp_il'] * .01
```

```
In [40]: df1
Out[40]:
    unemp_il unemp_wi il_rescaled
a    5.6    6.1    0.056
b    5.7    6.0    0.057
c    5.8    6.1    0.058
```

```
In [41]: df2
Out[41]:
    unemp_il unemp_wi il_rescaled
a    5.6    6.1    0.056
b    5.7    6.0    0.057
c    5.8    6.1    0.058
```



|     | "col 1" | "col 2" | "col 3" |
|-----|---------|---------|---------|
| "a" | 1       | 4       | 7       |
| "b" | 2       | 5       | 8       |
| "c" | 3       | 6       | 9       |
|     |         |         |         |

df.loc[['a', 'b'], ['col 1', 'col 2']]
df.iloc[[0, 1], [0, 1]]