

Python Language Basics

This notebook introduces some Python language basics. It is designed for a code-along during the workshop. Some code blocks are deliberately incomplete or have bugs included.

To execute code: Place your cursor in the cell, then hit SHIFT + ENTER

When writing computer code, there are *rules* and there are *conventions* (adapted from David Dempsey's [Python for Geoscientists](#) course)

- If you break a ***rule***, the code will not work.
- If you break a ***convention***, someone, somewhere puts a mark against your name in a book. At the end of times, there will be a final accounting.

Some Python rules:

- ***Syntax*** - we have very precise expectations about how you write computer code. If you type an opening a bracket, you must close it again later. Some lines must be terminated by a colon, - if you omit this, the code will not work. ***Learning syntax for a new code is very pedantic and a total pain.*** But you have to do it anyway, and at least Python returns readable error messages to help you understand your missteps...
- ***Indentation*** - Python reads indentation (not all languages do) and your code will not work if it is not correctly indented.

Some Python conventions:

- ***Commenting*** - it is helpful for the poor soul who has to read your poorly written Python (sometimes that is you, weeks or months later) if you have included little 'sign-posts' in the code, articulating what you are doing. These are called comments. They begin with a # symbol, after which you can write whatever you like and it will not be executed as a command.
- ***Sensible variable names*** - a word or words relating to the thing the variable represents but not too long. For example, if a variable contains the mean temperature, then Tmean is a sensible variable name, where as the_mean_temperature_of_the_profile or a1 are not sensible variable names.
- ***Layout*** - Although the computer reads Python line-by-line, using a vertical layout improves the human readability and your ability to comment code. Headings and the liberal use of whitespace improves readability.
- ***Structure*** - Python files and projects have a standard structure that improves readability. The structure of files vary, but all files should start with an explanation of what they do and all packages/modules should be imported at the top. For the advanced folks, more on Python project structure can be found [here](#).

Units are a common source of error. Approaches to managing this include:

- Include units in the variable names (my preferred) `Tmean_degC = 300`
- Include in-line comments on units and conversions used (good, but can be lost information) `Tmean = 300 # mean temp in degC`
- Consider tools like [Pint](#) to manage units, if it is a large problem (good, but assumes everyone knows how to use pint)

Python Packages

```
In [ ]: # Import packages

''' Good practice:
Import all libraries/packages used at the top of the document'''

import matplotlib.pyplot as plt # foundation module for plotting
import numpy as np # for array based programming and advanced math
import math # for basic mathematical methods
import pandas as pd # for spreadsheet-like methods + more
import matplotlib.pyplot as plt # foundation module for plotting
import seaborn as sns # for advanced plotting methods
import matplotlib.dates as mdates # for formatting datetime in plot axis

''' Good practice:
Packages have standard short names.
Using the standard name improves readability.
Look at the docs if you are unsure what the standard name is.
For example, https://matplotlib.org/3.5.3/api/\_as\_gen/matplotlib.pyplot.html) ''';
```

```
In [ ]: import antigravity

# installing a package can launch code
# be careful what you install!
```

Python Language Basics

```
In [ ]: print('hello world')
```

hello world

```
In [ ]: # variable
# the string 'hello world' has been assigned to the variable x

x = 'hello world'

print(x)
print(len(x))
```

```
hello world
11
```

```
In [ ]: # Types: string, integer, float (more on slide)
        # Python is a dynamic typed language, checking type (variable state)

        print(type(x))
```

```
<class 'str'>
```

Data structures and the many forms of list

<https://docs.python.org/3/tutorial/datastructures.html#>

```
In [ ]: # Lists and array (numpy)

        my_list = [1,2,3,4]
        print(my_list)
        print(type(my_list))

        my_array = np.array([1,2,3,4])
        print(my_array)
        print(type(my_array))
```

```
[1, 2, 3, 4]
```

```
<class 'list'>
```

```
[1 2 3 4]
```

```
<class 'numpy.ndarray'>
```

```
In [ ]: array_of_10s = np.array([10,10,10,10])
        array_of_5s = np.array([5,5,5,5])

        new_array = array_of_5s + array_of_10s

        print(new_array)

        # array-based programming
```

```
[15 15 15 15]
```

```
In [ ]: list_of_10s = [10,10,10,10]
        list_of_5s = [5,5,5,5]

        new_list = list_of_5s + list_of_10s

        print(new_list)
```

```
[5, 5, 5, 5, 10, 10, 10, 10]
```

```
In [ ]: # Basics: Complex Lists and arrays

        complex_list = ['harry', 1, 9.5, [2,3,4]]
        print(complex_list)

        complex_array = np.array(['harry', 1, 9.5,[2,3,4]],dtype=object)
        print(complex_array, complex_array.shape)

        nD_array = np.array([[4,5,6],[1,2,3]])
```

```
print(nD_array, nD_array.shape)

# shape tells us the number of elements in each dimension
```

```
['harry', 1, 9.5, [2, 3, 4]]
['harry' 1 9.5 list([2, 3, 4])] (4,)
[[4 5 6]
 [1 2 3]] (2, 3)
```

```
In [ ]: # tuple - a fixed collection of objects or variables

my_tuple = (3, 5, 7)

my_object = [9.1,9.2,9.3]

complex_tuple = (3, 5, 7, ['d','wow',3.2], 'fish', my_object)

print(type(complex_tuple))

# Lists vs tuples
# Tuples are more memory efficient than lists
# Generally, people expect lists to contain one type while it is more acceptable to
```

```
<class 'tuple'>
```

```
In [ ]: # indexing (lists, tuples and arrays)

print(complex_tuple[1])
print(complex_tuple[3][1])

print(complex_tuple[5][-1]) # get 9.3 out of complex_tuple
print(complex_tuple[5][2]) # get 9.3 out of complex_tuple

# note how python starts counting at zero, so the first element = 0
```

```
5
wow
9.3
9.3
```

```
In [ ]: # dictionary - a value is mapped to a key
colors = {
    'blue': '#36648B', # nice low-saturation blue
    'brown': '#8B5D36', # complementary color to the blue
}

print(colors)

print(type(colors))

print(colors['blue'])

colors['blue'] = 'another blue'
print(colors['blue'])
```

```
{'blue': '#36648B', 'brown': '#8B5D36'}
<class 'dict'>
#36648B
another blue
```

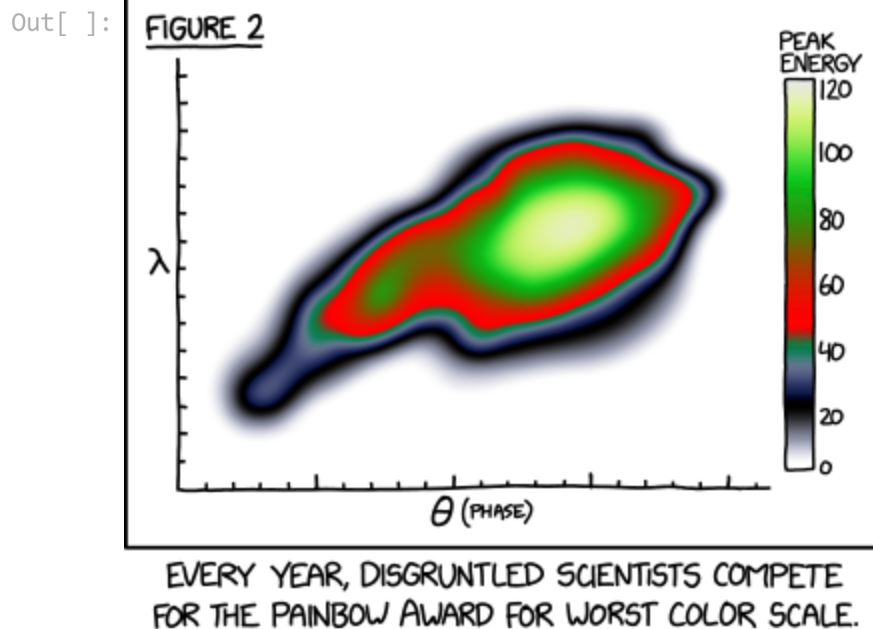
Colors in Python:

- Hex colors <https://www.color-hex.com/>
- Named colors https://matplotlib.org/stable/gallery/color/named_colors.html
- Colormaps <https://matplotlib.org/stable/tutorials/colors/colormaps.html>

Beware the impact of color on your analysis!

<https://hess.copernicus.org/articles/25/4549/2021/>

```
In [ ]: from IPython import display
display.Image("https://imgs.xkcd.com/comics/painbow_award.png")
```



Python as Calculator

```
In [ ]: radius_m = 3
area_m2 = math.pi * radius_m**2

print(area_m2)
```

28.274333882308138

Estimating well injectivity using field operational data:

$$II = \frac{Q}{P_H + WHP - P_F - P_{FZ}}$$

where Q Flow rate (t/hr), P_H is hydrostatic pressure inside the well (bara), WHP is wellhead pressure (bara), P_F is the pressure of frictional losses (bara), and P_{FZ} is the reservoir

pressure at the feedzone or pivot point (bara).

(Siega et al. (2014) *Quantifying the effect of temperature on well injectivity, New Zealand Geothermal Workshop*)

Python uses Latex for formatting mathematical expressions

https://www.overleaf.com/learn/latex/Mathematical_expressions

```
In [ ]: # Variable names:
# Use common abbreviations or write it out
# Do not just use equation terms (Q, Ph, WHP) unless they are universal and defined

flow_rate_tph = 400
hydrostatic_pressure_bar = 115
wellhead_pressure_bar = 1
friction_loss_bar = 9.7
feedzone_pressure_bar = 84

ii_tphrpbar = flow_rate_tph / (hydrostatic_pressure_bar + wellhead_pressure_bar -
print(ii_tphrpbar)
```

17.937219730941706

```
In [ ]: # Using for loops to calculate value for multiple values - iterate over one list

flow_rates_tph = [400, 300, 200, 100]

varied_rate_ii_tphrpbar = []

for rate in flow_rates_tph:
    ii = rate / (hydrostatic_pressure_bar + wellhead_pressure_bar - friction_loss
    varied_rate_ii_tphrpbar.append(ii)

print(varied_rate_ii_tphrpbar)
```

[17.937219730941706, 13.45291479820628, 8.968609865470853, 4.4843049327354265]

Algorithm building: Logical operators and flow control

Tests that return True or False

Boolean operators

- And
- Or
- Not

Comparison operators

- == Equal to
- != Not equal to
- < Less than
- > Greater Than
- <= Less than or Equal to
- >= Greater than or Equal to

"if" statements

- if
- elif
- else

'for' loop

- pass in a list or array that is iterated over

Refer to [this link](#) for other options and various examples.

```
In [ ]: # Basics: "for Loop" and whitespace
for n in [1,2,3,4,5]:
    print(n + 10)
```

```
11
12
13
14
15
```

```
In [ ]: # Using for Loops to calculate value for multiple values - iterate over many Lists

flow_rates_tph = [400, 300, 200, 100]
wellhead_pressures_bar = [10, 8, 5, 1]

varied_rate_and_whp_ii_tphrpbar = []

for rate, whp in zip(flow_rates_tph, wellhead_pressures_bar):
    ii = rate / (hydrostatic_pressure_bar + whp - friction_loss_bar - feedzone_pr
    varied_rate_and_whp_ii_tphrpbar.append(ii)

print(varied_rate_and_whp_ii_tphrpbar)
```

```
[12.779552715654953, 10.238907849829353, 7.604562737642587, 4.4843049327354265]
```

```
In [ ]: # Using if statements to dictate behavior

flow_rates_tph = [400, 300, 200, 100]
wellhead_pressures_bar = [10, 8, 5, 1]

for rate, whp in zip(flow_rates_tph, wellhead_pressures_bar):
    ii = rate / (hydrostatic_pressure_bar + whp - friction_loss_bar - feedzone_pr
    if ii > 10:
```

```

    print('Great well!')
else:
    print(':-(')

```

```

Great well!
Great well!
:-(
:-(

```

Plotting

```

In [ ]: # Simple

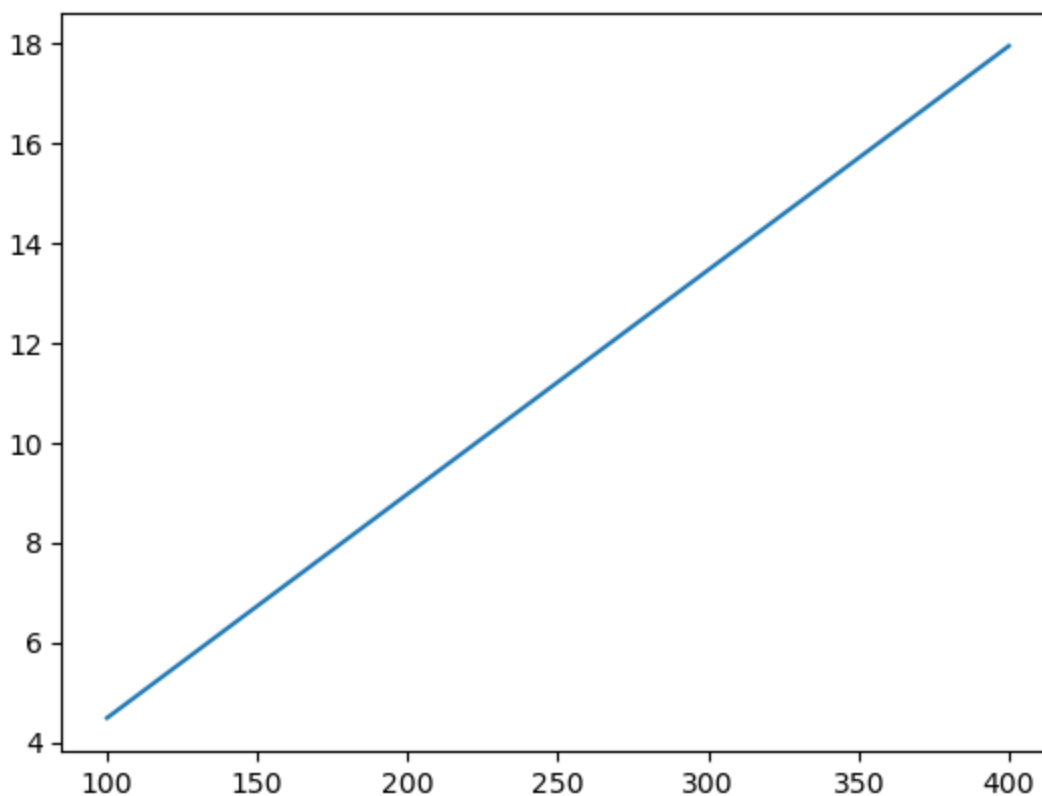
plt.plot(flow_rates_tph, varied_rate_ii_tphrpbar)

```

```

Out[ ]: [ <matplotlib.lines.Line2D at 0x1d7ea4d5760> ]

```



```

In [ ]: # More flexibility: the axs method
# when googling, use "matplotlib axs" to get the correct documentation

fig, ax = plt.subplots(1,1)

# the method plt.subplots() returns two things
# one we have called figure (f or fig) and this is analogous to a page in your book
# the other is the axis (one or many ax) which is analogous to the plot you draw on

ax.plot(
    flow_rates_tph,
    varied_rate_ii_tphrpbar,
    color = colors['brown'],

```



```

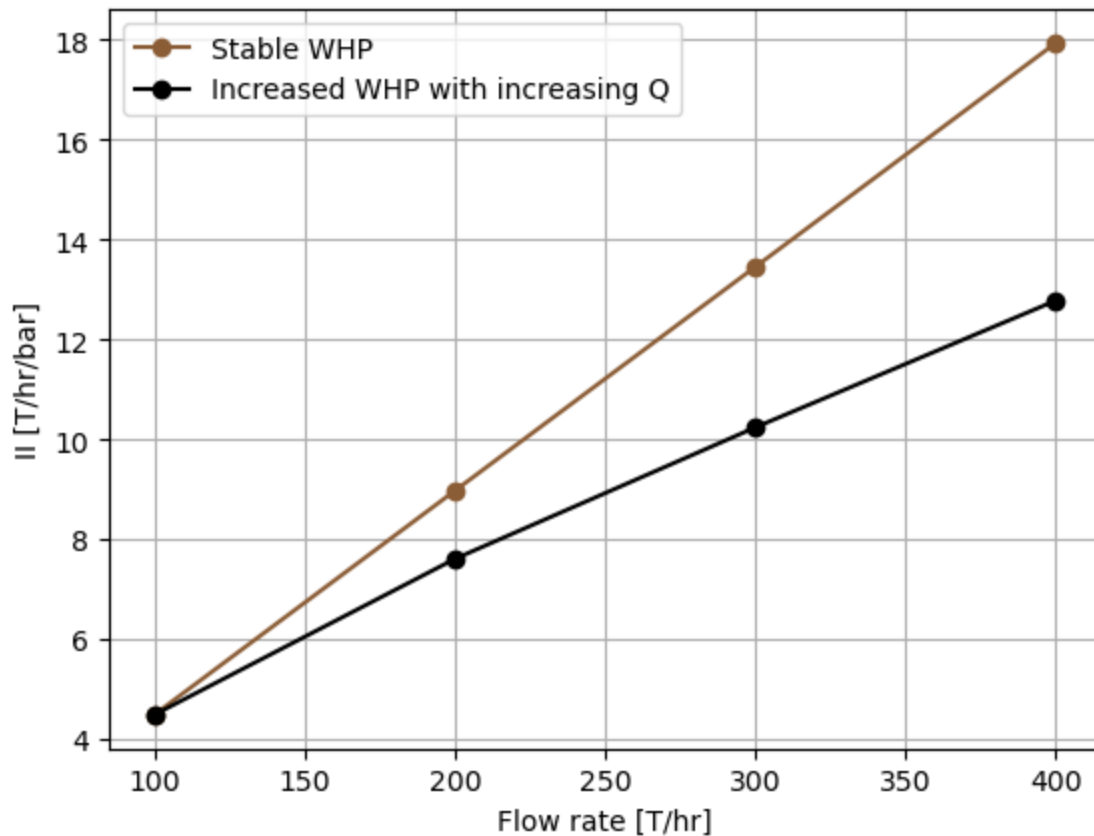
    marker = 'o',
    label = 'Stable WHP'
)

ax.plot(
    flow_rates_tph,
    varied_rate_and_whp_ii_tphrpbar,
    color = 'k',
    marker = 'o',
    label = 'Increased WHP with increasing Q'
)

ax.set_ylabel('II [T/hr/bar]')
ax.set_xlabel('Flow rate [T/hr]')
ax.legend()
ax.grid()

# https://github.com/ICWallis/tutorial-publication-ready-figures

```



Functions

```

In [ ]: # Functions = re-useable tools

def circle_area(radius):
    '''Calculate the area of a circle from the radius'''

    area = math.pi * radius**2

```

```

    return area

a = circle_area(5)
print(a)

```

78.53981633974483

```

In [ ]: #
        # Function
        #

def ii_from_operational_conditions(Q,Ph,WHP,Pf,Pfz):
    '''Calculate injectivity using field operational data

    For usage and case study, refer to Siega et al. (2014)
    Quantifying the effect of temperature on well injectivity,
    New Zealand Geothermal Workshop

    Args:
        Q (float): flow rate - t/hr
        Ph (float): hydrostatic pressure inside the well - bara
        WHP (float): wellhead pressure - bara
        Pf (float): pressure due to friction - bara
        Pfz (float): reservoir pressure at the feedzone or pivot point - bara

    Returns:
        injectivity - T/hr/bar
    '''

    ii = Q / (Ph + WHP - Pf - Pfz)

    return ii

#
# Usage
#

# Input parameters for well WJ-13
Q_tph = 400 # average for June
Ph_bara = 115 # calculated using depth to feedzone and average injection temperature
WHP_bara = 1 # average for June
Pf_bara = 9.7 # calculated by finding the root of the Colebrook equation
Pfz_bara = 84 # from the reservoir pressure correlation

WJ13_June_ii_tphrpbar = ii_from_operational_conditions(Q_tph, Ph_bara, WHP_bara, Pf_bara, Pfz_bara)

print(round(WJ13_June_ii_tphrpbar,2))

# Functions can be placed in a file that is imported at the start
# This reduces the code you are looking at
# and enables you to focus on the science, rather than the code

```

17.94

```

In [ ]: df = pd.read_excel(r'1_Introduction__Case_study_data.xlsx', sheet_name='Sheet1')

```

df

```
Out[ ]:
Well      Date  Q_tph  Ph_bar  WHP_bar  Pf_bar  Pfz_bar
0  W-1  2022-01-01    400    115      1.0    9.70     84
1  W-1  2022-02-01    400    115      1.5    9.70     84
2  W-1  2022-03-01    400    115      2.0    9.70     84
3  W-1  2022-04-01    400    115      2.8    9.70     84
4  W-2  2022-01-01    200    100      8.0    9.68     70
5  W-2  2022-02-01    200    100      5.0    9.68     70
6  W-2  2022-03-01    200    100      2.0    9.68     70
7  W-2  2022-04-01    200    100      1.0    9.68     70
```

```
In [ ]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8 entries, 0 to 7
Data columns (total 7 columns):
#   Column      Non-Null Count  Dtype
---  -
0   Well        8 non-null      object
1   Date        8 non-null      datetime64[ns]
2   Q_tph       8 non-null      int64
3   Ph_bar      8 non-null      int64
4   WHP_bar     8 non-null      float64
5   Pf_bar      8 non-null      float64
6   Pfz_bar     8 non-null      int64
dtypes: datetime64[ns](1), float64(2), int64(3), object(1)
memory usage: 576.0+ bytes
```

```
In [ ]: df['ii_tphrpbar'] = ii_from_operational_conditions(df.Q_tph, df.Ph_bar, df.WHP_bar)
df
```

```
Out[ ]:
Well      Date  Q_tph  Ph_bar  WHP_bar  Pf_bar  Pfz_bar  ii_tphrpbar
0  W-1  2022-01-01    400    115      1.0    9.70     84    17.937220
1  W-1  2022-02-01    400    115      1.5    9.70     84    17.543860
2  W-1  2022-03-01    400    115      2.0    9.70     84    17.167382
3  W-1  2022-04-01    400    115      2.8    9.70     84    16.597510
4  W-2  2022-01-01    200    100      8.0    9.68     70     7.062147
5  W-2  2022-02-01    200    100      5.0    9.68     70     7.898894
6  W-2  2022-03-01    200    100      2.0    9.68     70     8.960573
7  W-2  2022-04-01    200    100      1.0    9.68     70     9.380863
```

```
In [ ]: # Advanced plot for data analysis

fig, ax = plt.subplots(1,1,figsize=(10,6))

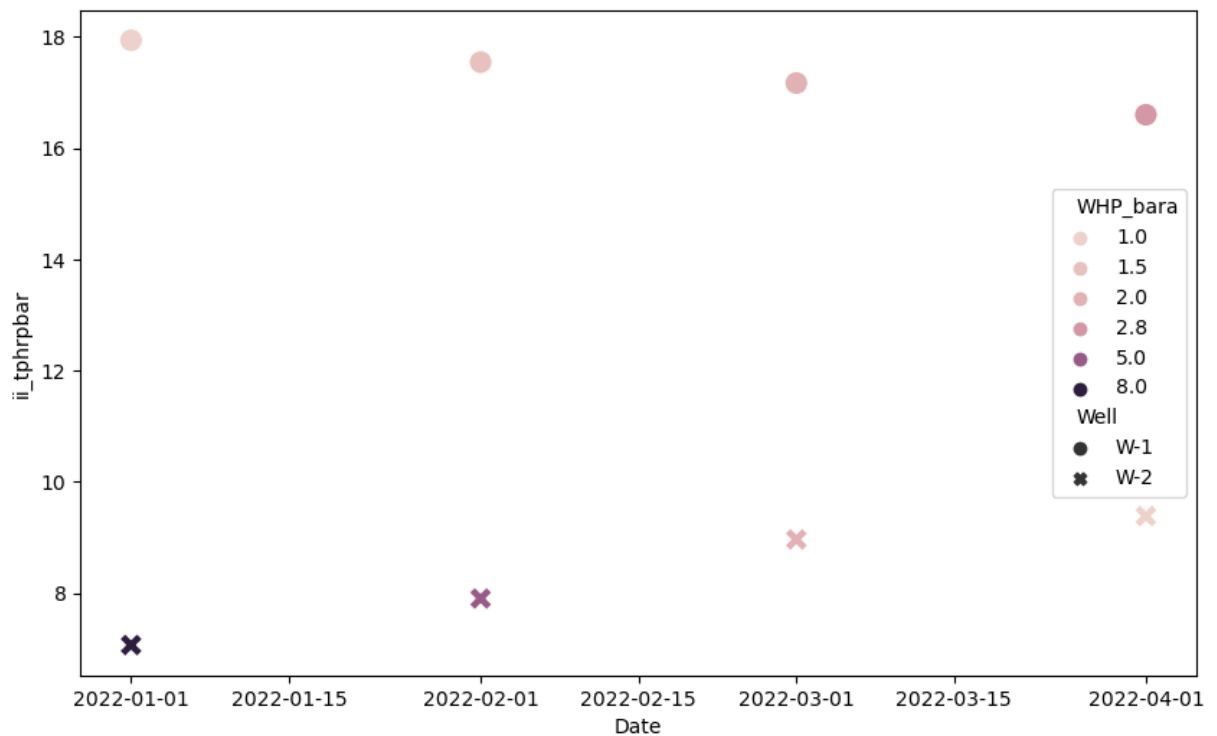
# https://seaborn.pydata.org/generated/seaborn.scatterplot.html

sns.scatterplot(
    x='Date', # Pandas column name for x data
    y='ii_tphrpbar', # Pandas column name for y data
    data=df, # Pandas dataframe name
    ax=ax, # name of the axis that the seaborn plot goes in
    s=140, # marker size
    hue='WHP_bar', # marker colour
    style='Well', # marker style
)

#plt.savefig('Case_study_plot1.png',facecolor='w')
```

```
c:\Users\Irene\miniconda3\envs\workshop_env\lib\site-packages\seaborn\_oldcore.py:14
98: FutureWarning: is_categorical_dtype is deprecated and will be removed in a futur
e version. Use isinstance(dtype, CategoricalDtype) instead
    if pd.api.types.is_categorical_dtype(vector):
c:\Users\Irene\miniconda3\envs\workshop_env\lib\site-packages\seaborn\_oldcore.py:14
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    if pd.api.types.is_categorical_dtype(vector):
```

```
Out[ ]: <Axes: xlabel='Date', ylabel='ii_tphrpbar'>
```



In []: *# Building on the above code to make a nice version for a report/publication*

```
# Make empty plot
fig, ax = plt.subplots(1,1,figsize=(8,4))

# Add data to plot
sns.scatterplot(
    x='Date', # Pandas column name for x data
    y='ii_tphrpbar', # Pandas column name for y data
    data=df, # Pandas dataframe name
    ax=ax, # name of the axis that the seaborn plot goes in
    s=140, # marker size
    style='Well', # marker style
    hue='WHP_bar', # marker colour
    #palette='cividis',
    #size='Q_tph',
    #sizes=(140, 200)
    zorder=10 # places markers in front of grid
)

# Seaborn color pallets https://seaborn.pydata.org/tutorial/color_palettes.html

# Format axis
ax.set_ylim(5,20)

ax.xaxis.set_major_formatter(mdates.DateFormatter("%d %b"))

ax.set_xlabel('') # Replaces auto date label with nothing

ax.set_ylabel('II [T/hr/bar]')

# Place legend outside the plot area
ax.legend()
```

```

    loc='center left',
    bbox_to_anchor=(1.05, 0.45),
    ncol=1,
)

# Add title
plt.title('Injection Well Performance Q1 2022')

# Add grid
ax.grid(linestyle=':', alpha=0.8)

# Export figure
'''
plt.savefig(
    'Case_study_plot2.png',
    dpi=400,
    facecolor='w',
    bbox_inches='tight'
)'''

```

```

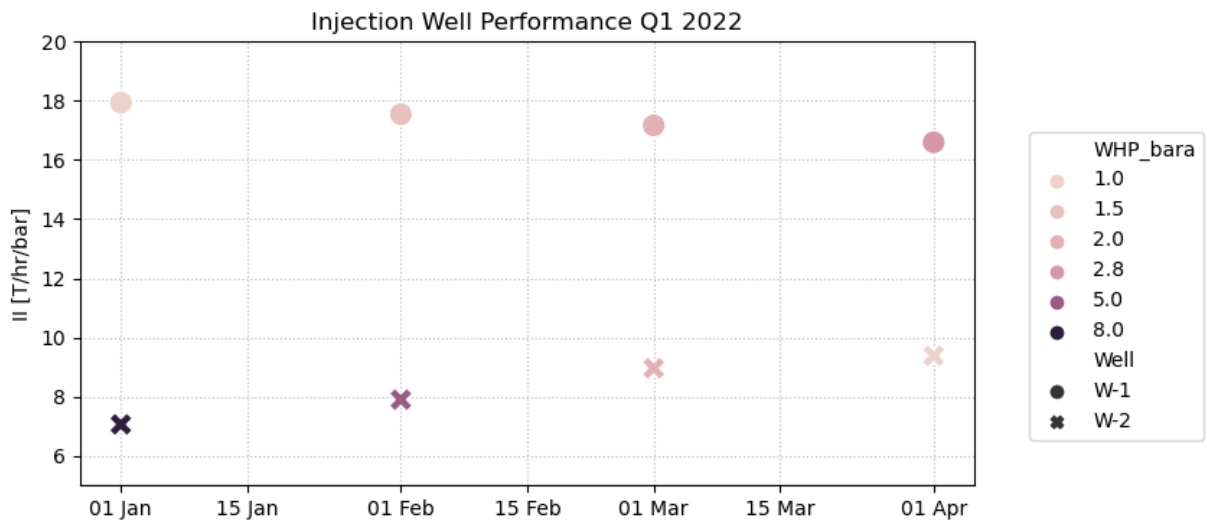
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e version. Use isinstance(dtype, CategoricalDtype) instead
    if pd.api.types.is_categorical_dtype(vector):

```

```

Out[ ]: "\nplt.savefig(\n    'Case_study_plot2.png',\n    dpi=400,\n    facecolor='w',\n    bbox_inches='tight'\n    )"

```



Sub-select data using comparison operator

```
In [ ]: df.columns
```

```
Out[ ]: Index(['Well', 'Date', 'Q_tph', 'Ph_bar', 'WHP_bar', 'Pf_bar', 'Pfz_bar',
              'ii_tphrpbar'],
              dtype='object')
```

```
In [ ]: df
```

```
Out[ ]:
```

	Well	Date	Q_tph	Ph_bar	WHP_bar	Pf_bar	Pfz_bar	ii_tphrpbar
0	W-1	2022-01-01	400	115	1.0	9.70	84	17.937220
1	W-1	2022-02-01	400	115	1.5	9.70	84	17.543860
2	W-1	2022-03-01	400	115	2.0	9.70	84	17.167382
3	W-1	2022-04-01	400	115	2.8	9.70	84	16.597510
4	W-2	2022-01-01	200	100	8.0	9.68	70	7.062147
5	W-2	2022-02-01	200	100	5.0	9.68	70	7.898894
6	W-2	2022-03-01	200	100	2.0	9.68	70	8.960573
7	W-2	2022-04-01	200	100	1.0	9.68	70	9.380863

```
In [ ]: # using reassignment - take care of notebook order!
df = df[df.Well == 'W-1']
```

```
In [ ]: df
```


Out[]:

	Well	Date	Q_tph	Ph_bar	WHP_bar	Pf_bar	Pfz_bar	ii_tphrpbar
0	W-1	2022-01-01	400	115	1.0	9.7	84	17.937220
1	W-1	2022-02-01	400	115	1.5	9.7	84	17.543860
2	W-1	2022-03-01	400	115	2.0	9.7	84	17.167382
3	W-1	2022-04-01	400	115	2.8	9.7	84	16.597510

Where to from here?

The best way forward is to learn by doing!

I most commonly use python to...

Document methods and analysis in Jupyter notebooks:

- Methods are displayed in sequence
- Can combine notes, equations, views on the data and plots in an easily read format
- Can be exported to html so non-coding folks can read them

Automate tasks:

- Especially useful for repetitive data processing tasks
- [Automate the Boring Stuff](#) is a great book for getting started with Python and automation

Handle large datasets, do complex calculations, make interactive graphics, and more!

Learn more Python skills using on-line resources:

- A [list of useful resources](#) for geoscientists learning python has been put together by Michael Harty
- [Practical Python](#) great course if you can survive stock tickers. Self driven and comprehensive.
- David Dempsey's [Python for Geoscientists](#) specific to geosciences. Designed to be classroom taught, but chock-full of useful examples.
- [Plotting with Python](#) for basic to advanced plotting with matplotlib. Designed to be classroom taught, but see solutions and recipes folders for code examples.
- [Software carpentry](#) a wide range of learning resources
- [EdX course](#)

Find your community and join [Software Underground](#) to connect with people who do computers + subsurface

- Active slack community where people help each other (note that they are currently moving to a new platform because of \$\$)
- Annual virtual conference with lots of free training opportunities
- [SWUG YouTube channel](#), with loads of subsurface-relevant tutorials

Don't be discouraged. It takes time to learn any language, including Python. But even if it takes years to become fluent, just a few Python basics can open a whole new world up for you. Have a read of this post by [Peter Norvig](#) for some sage advice on how to learn programming.