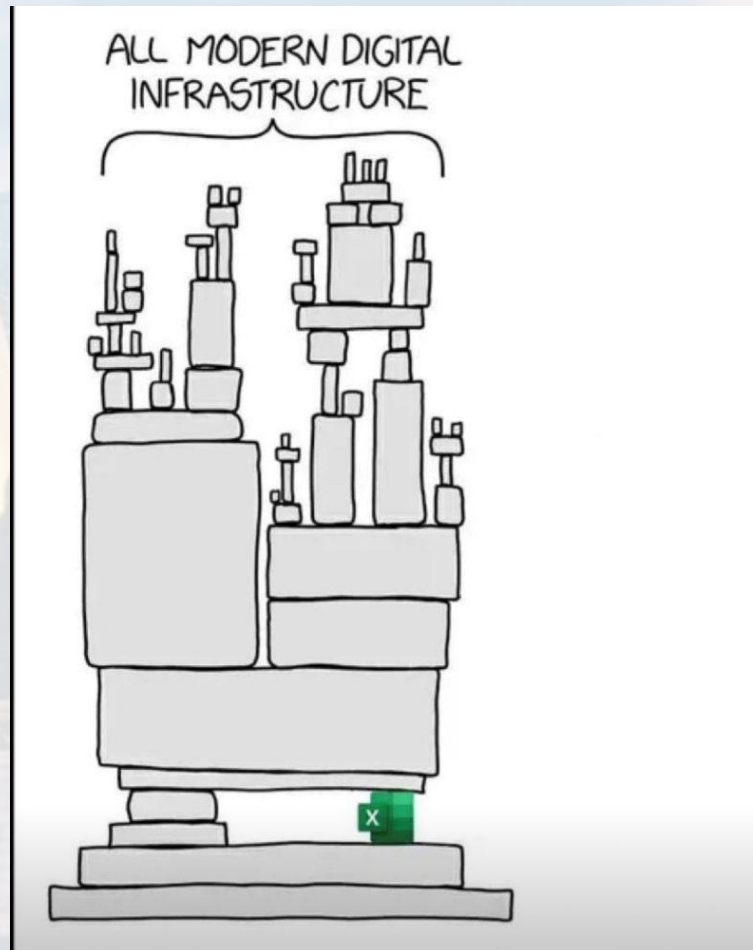


*M. Hohle:*

# Physics 77: Introduction to Computational Techniques in Physics





<u>Week</u>	<u>Date</u>	<u>Topic</u>
1	June 12th	Programming Environment & UIs for Python, Programming Fundamentals
2	June 19th	Basic Types in Python
3	June 26th	Parsing, Data Processing and File I/O, Visualization
<b>4</b>	<b>July 3rd</b>	<b>Functions, Map &amp; Lambda</b>
5	July 10th	Random Numbers & Probability Distributions, Interpreting Measurements
6	July 17th	Numerical Integration and Differentiation
7	July 24th	Root finding, Interpolation
8	July 31st	Systems of Linear Equations, Ordinary Differential Equations (ODEs)
9	Aug 7th	Stability of ODEs, Examples
10	Aug 14th	Final Project Presentations



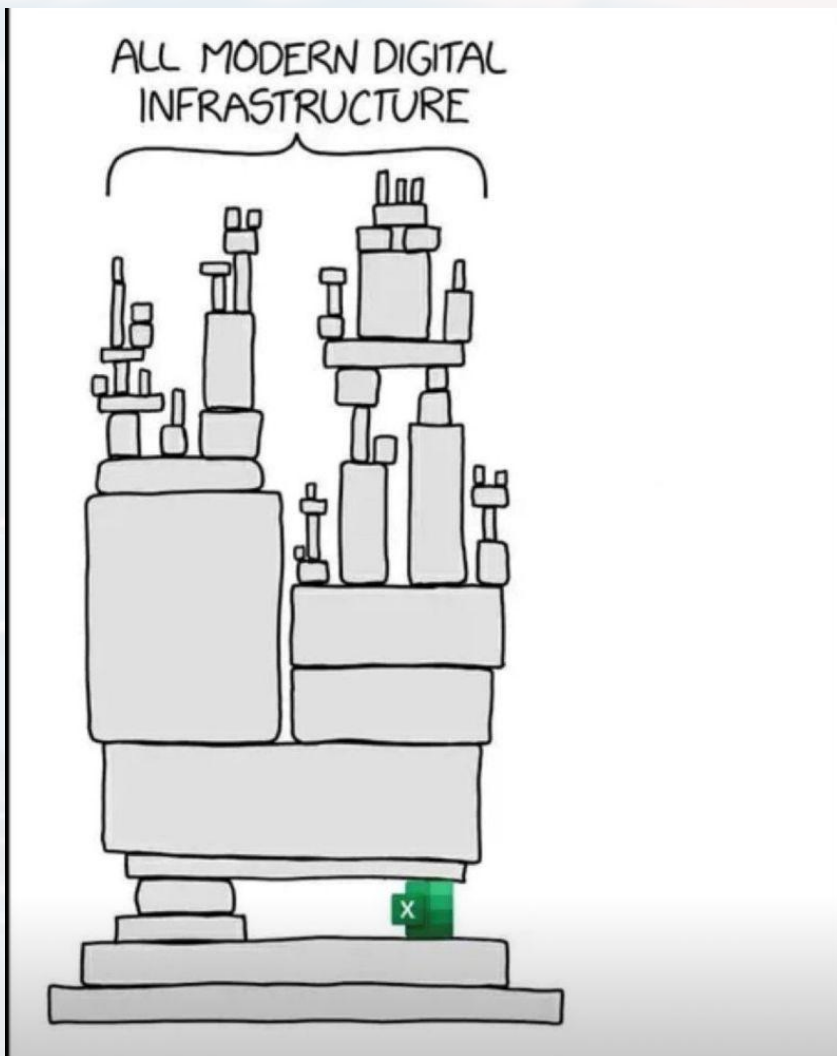
## Outline

### Control Structures

- General Idea and Structure
- `for` Loops and Comprehension
- `if`, `else` and `elif`
- `while`
- `break`, `continue` and `pass`

### Functions

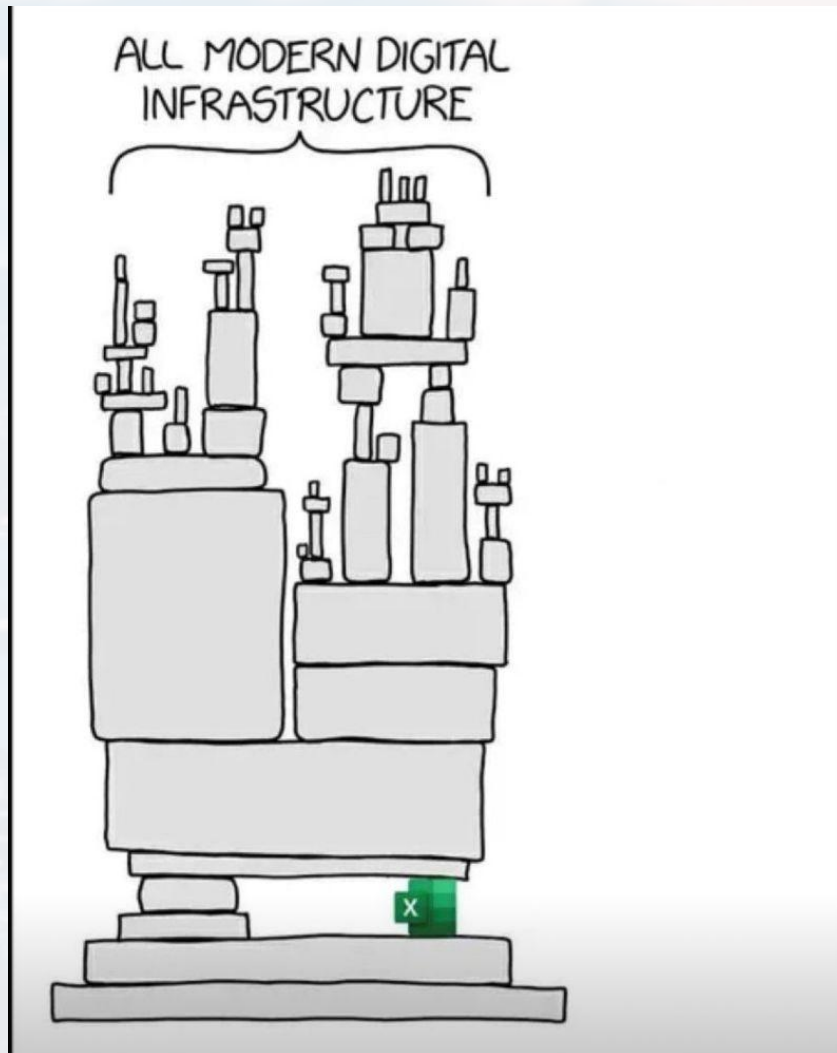
- `lambda`
- `map`
- `def`
- `*args` and `**kwargs`







## Outline



### Control Structures

#### - General Idea and Structure

- for Loops and Comprehension
- if, else and elif
- while
- break, continue and pass

### Functions

- lambda
- map
- def
- \*args and \*\*kwargs



often (not always): iterating over an object

numeric: `int`, `float`, `complex` `5`, `5.55`, `(5+5j)`

## iteratable

strings: `str` `'this is a string'`, `"this is a string"`

sequence: `list`, `tuple`, `range` `my_tuple = (3, 'a', [2,3,4,5])`  
`range(10)`

## mutable

`my_list = [1, 2, 'a']`

mapping: `dict` `my_dict = {1: 'a', 2: 'b'}`

mapping: `set` `my_set = {1, 2, 'a'}`

boolean: `True` `False`

none type: `None`

callable: functions, methods, classes `def`, `class`, `map`, `lambda`

modules: `from my_module import my_method as my_alias`



often (not always): iterating over an object

## iteratable

strings: `str`

`'this is a string', "this is a string"`

sequence: `list`, `tuple`, `range`

`my_tuple = (3, 'a', [2,3,4,5])`  
`range(10)`

## mutable

`my_list = [1, 2, 'a']`

mapping: `dict`

`my_dict = {1: 'a', 2: 'b'}`

mapping: `set`

`my_set = {1, 2, 'a'}`



often (not always): iterating over an object

## iteratable

strings: `str`

`'this is a string', "this is a string"`

sequence: `list`, `tuple`, `range`

`my_tuple = (3, 'a', [2,3,4,5])`

`range(10)`

`my_list = [1, 2, 'a']`

mapping: `dict`

`my_dict = {1: 'a', 2: 'b'}`

mapping: `set`

`my_set = {1, 2, 'a'}`

## when to use:

- repetitive operations
- distinguish between different cases/ parts of the DA pipeline

## but:

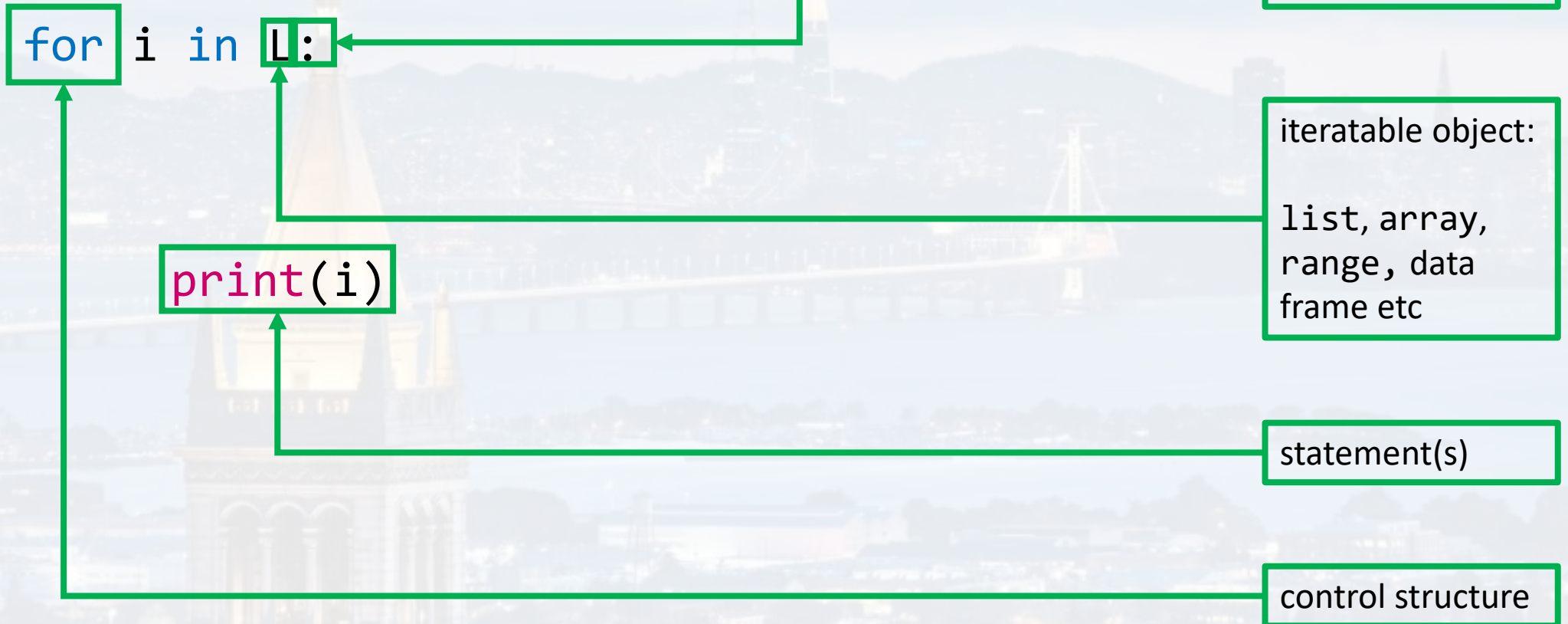
- avoid (especially `for` and `while`) loops as far as possible
- loops are slow → vectorization (see later)





often (not always): iterating over an object

```
L = ['a', 'b', 'c', 'd', 'e']
```







often (not always): iterating over an object

```
L = ['a', 'b', 'c', 'd', 'e']
```

```
for i in L:
```

```
    print(i)
```

free index variable

four blank spaces  
or tab

```
In [2]: L = ['a', 'b', 'c', 'd', 'e']
```

```
In [3]: for i in L:
```

```
....:
```

```
....: print(i)
```

```
....:
```

```
a
```

```
b
```

```
c
```

```
d
```

```
e
```



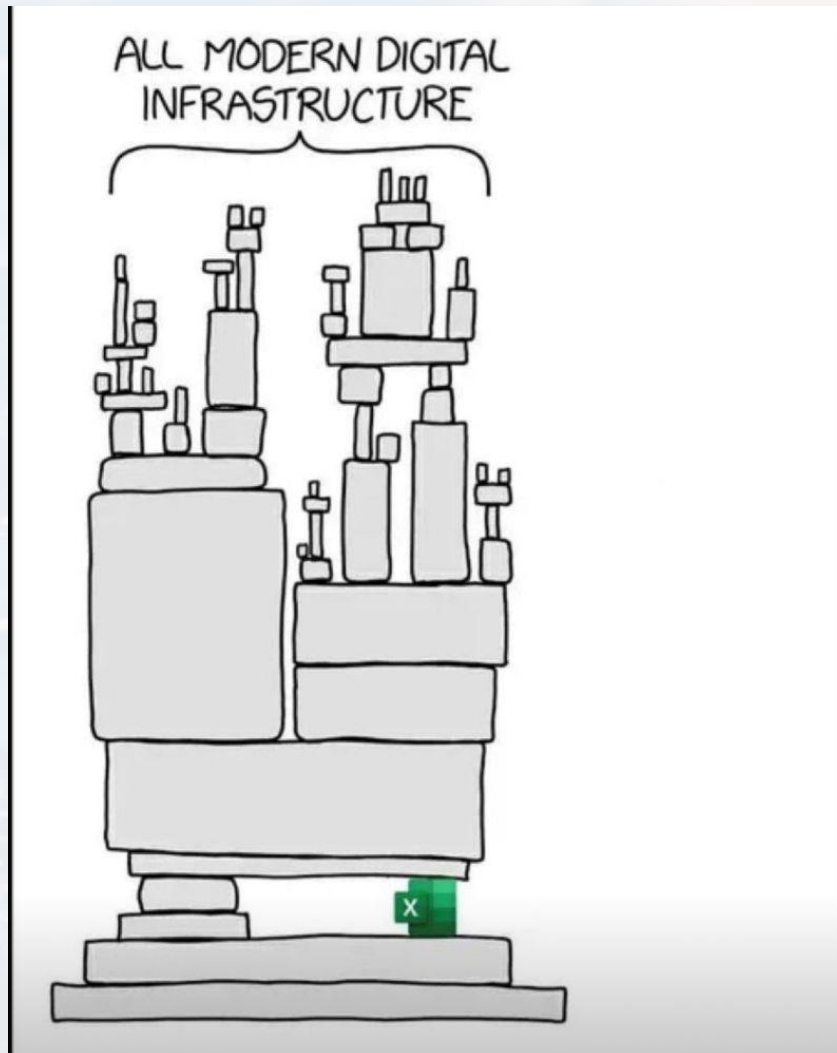
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- while
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### Functions

- lambda
- map
- def
- \*args and \*\*kwargs





```
L = ['a', 'b', 'c', 'd', 'e']
```

```
for i in L:
```

```
    print(i)
```

iteratable object:

list, array,  
range, data  
frame etc

```
for i in 5:
```

```
    print(i)
```

vs

```
for i in range(5):
```

```
    print(i)
```

```
Traceback (most recent call last):
```

```
  Cell In[1], line 1  
    for i in 5:
```

```
TypeError: 'int' object is not iterable
```

```
In [3]: for i in range(5):
```

```
    ...:
```

```
    ...:     print(i)
```

```
    ...:
```

```
0
```

```
1
```

```
2
```

```
3
```

```
4
```





```
L = ['a', 'b', 'c', 'd', 'e']
```

iterating over **content and index** of an object

```
for i, j in enumerate(L):  
  
    print(str(i) + str(j))
```

```
0a  
1b  
2c  
3d  
4e
```



```
L = ['a', 'b', 'c', 'd', 'e']
```

iterating over **two** objects **simultaneously**

```
R = range(0,10,2)
```

```
for i, j in zip(R, L):  
    print(str(i) + str(j))
```

```
0a  
2b  
4c  
6d  
8e
```

**note:** Even works, if objects have different lengths.  
Just stops with the shortest object



```
L = ['a', 'b', 'c', 'd', 'e']
```

```
R = range(0,10,2)
```

iterating over **two** objects **simultaneously** and over **indices and content**

```
for i, (j, k) in enumerate(zip(R, L)):  
    print(str(i) + str(j) + k)
```

```
00a  
12b  
24c  
36d  
48e
```





The more pythonic way is using *comprehension*

```
from math import *
```

```
N = 10
```

```
Factorial = [None]*N
```

```
for n in range(N):
```

```
    Factorial[n] = factorial(n)
```

Index ^	Type	Size	
0	int	1	1
1	int	1	1
2	int	1	2
3	int	1	6
4	int	1	24
5	int	1	120
6	int	1	720
7	int	1	5040
8	int	1	40320
9	int	1	362880

*comprehension*

```
Factorial = [factorial(n) for n in range(N)]
```

Index ^	Type	Size	
0	int	1	1
1	int	1	1
2	int	1	2
3	int	1	6
4	int	1	24
5	int	1	120
6	int	1	720
7	int	1	5040
8	int	1	40320
9	int	1	362880

**note:** very common in the  
Python community

shorter, often faster

only if loops are not  
too complex



The more pythonic way is using *comprehension*

```
NT    = 'ACGT'  
Code = [[1,0,0,0],  
         [0,1,0,0],  
         [0,0,1,0],  
         [0,0,0,1]]
```

```
Dict = {}
```

```
Dict = {nt: code for code, nt in zip(Code, NT)}
```

```
for code, nt in zip(Code, NT):  
    Dict[nt] = code
```

```
Dict['A'] Dict['A']  
[1, 0, 0, 0]
```

```
Dict['A'] Dict['A']  
[1, 0, 0, 0]
```



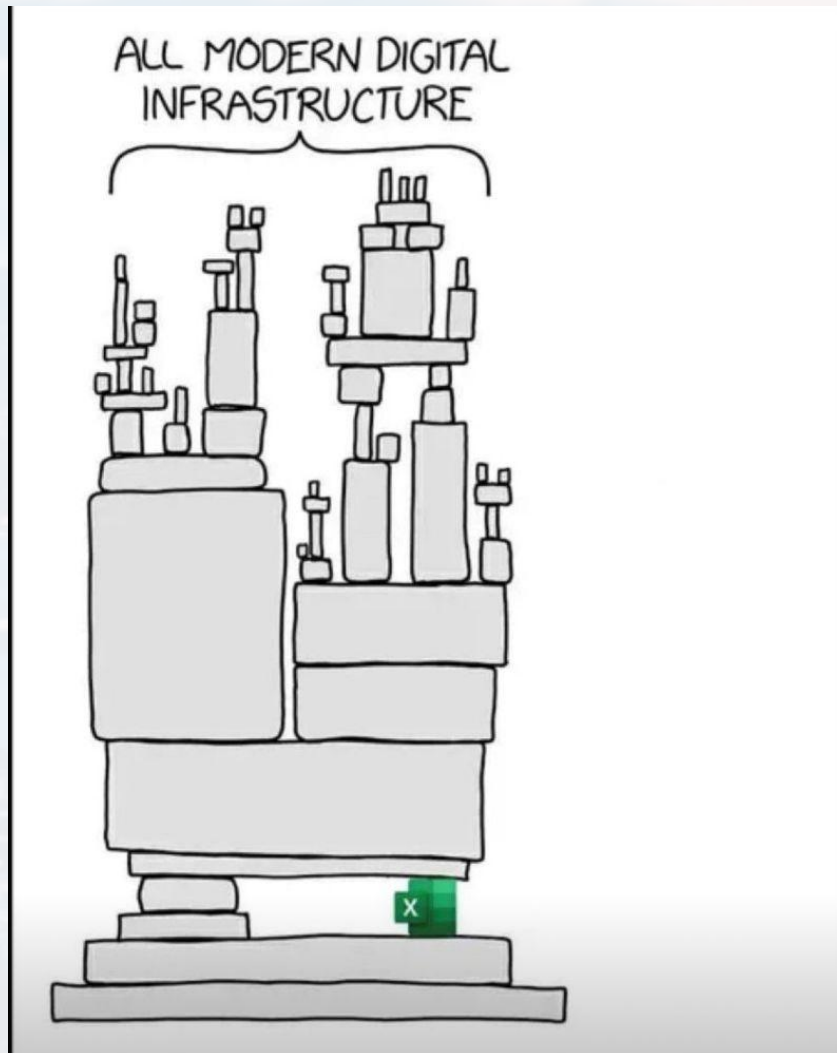
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```
for n in range(10):
```

```
    if n%2 == 0:
```

```
        print('even number: ' + str(n))
```

```
even number: 0  
even number: 2  
even number: 4  
even number: 6  
even number: 8
```

n

condition

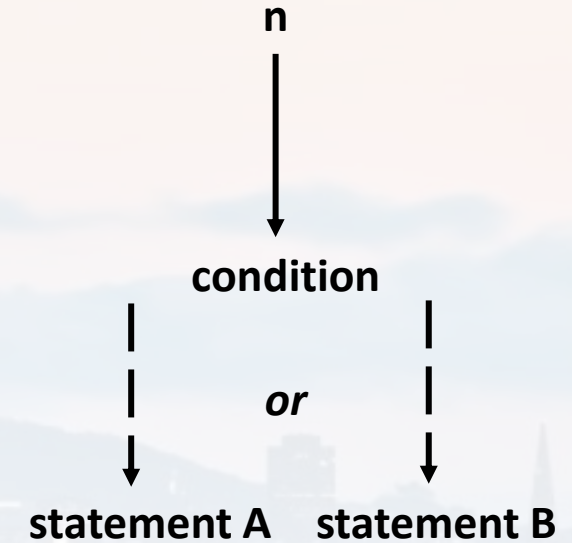
statement

applies if a  
condition is true

a logical  
condition  
(therefore ==)



```
for n in range(10):  
  
    if n%2 == 0:  
        print('even number: ' + str(n))  
  
    else:  
        print('odd number: ' + str(n))
```



```
even number: 0  
odd number: 1  
even number: 2  
odd number: 3  
even number: 4  
odd number: 5  
even number: 6  
odd number: 7  
even number: 8  
odd number: 9
```



```
for n in range(1,10):
```

```
    if n%2 == 0:
```

```
        print('even number: ' + str(n))
```

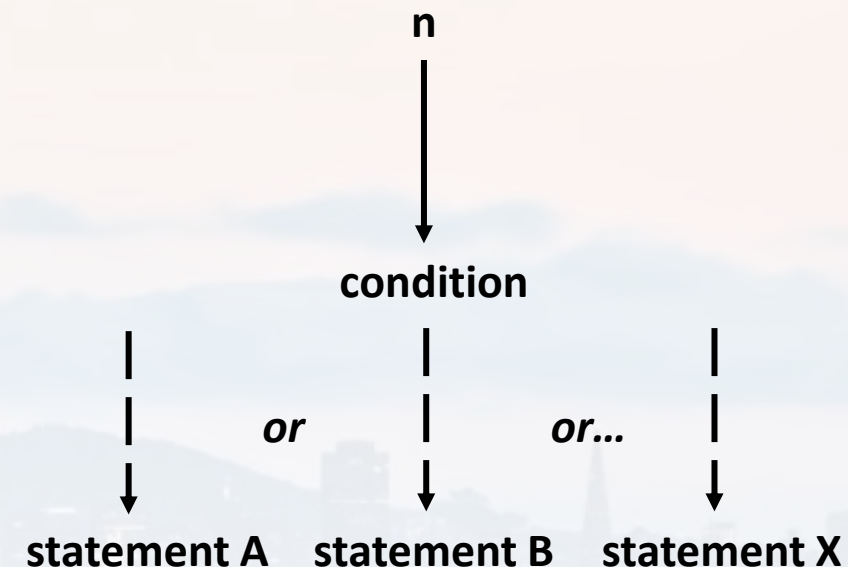
```
    if n%3 == 0:
```

```
        print('multiple of 3: ' + str(n))
```

```
    if n%5 == 0:
```

```
        print('multiple of 5: ' + str(n))
```

```
even number: 2
multiple of 3: 3
even number: 4
multiple of 5: 5
even number: 6
multiple of 3: 6
even number: 8
multiple of 3: 9
```



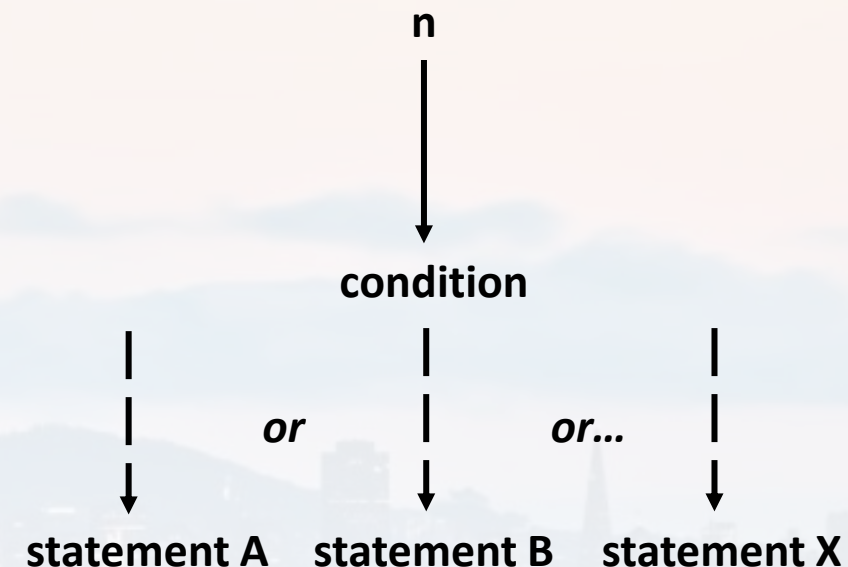
two conditions  
are true → **not**  
exclusive





```
for n in range(1,10):  
    if n%2 == 0:  
        print('even number: ' + str(n))  
    elif n%3 == 0:  
        print('multiple of 3: ' + str(n))  
    elif n%5 == 0:  
        print('multiple of 5: ' + str(n))
```

```
even number: 2  
multiple of 3: 3  
even number: 4  
multiple of 5: 5  
even number: 6  
even number: 8  
multiple of 3: 9
```



once a condition  
applies → runs  
statement  
**exclusively**



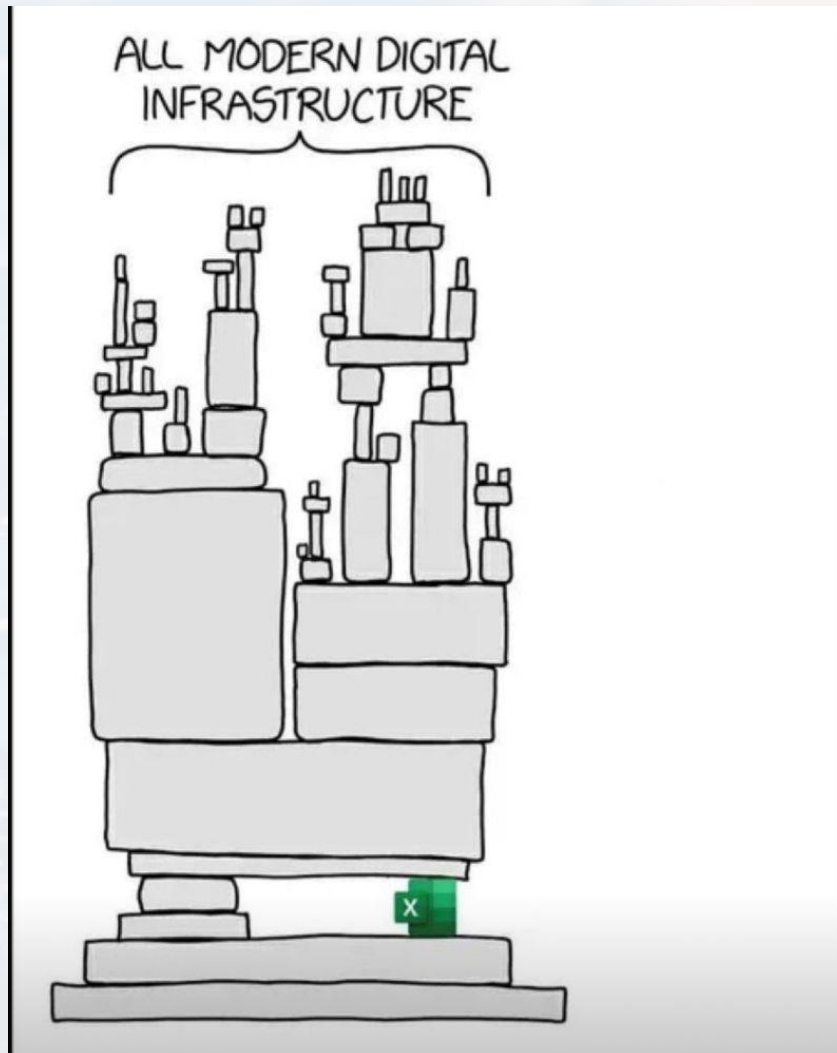
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```
n = 0
```

```
while n < 10:
```

```
    n += 1  
    print(n)
```



```
1  
2  
3  
4  
5  
6  
7  
8  
9  
10
```

**note:** make sure, that condition will be  
false at some point → may run infinitely  
→ logical error





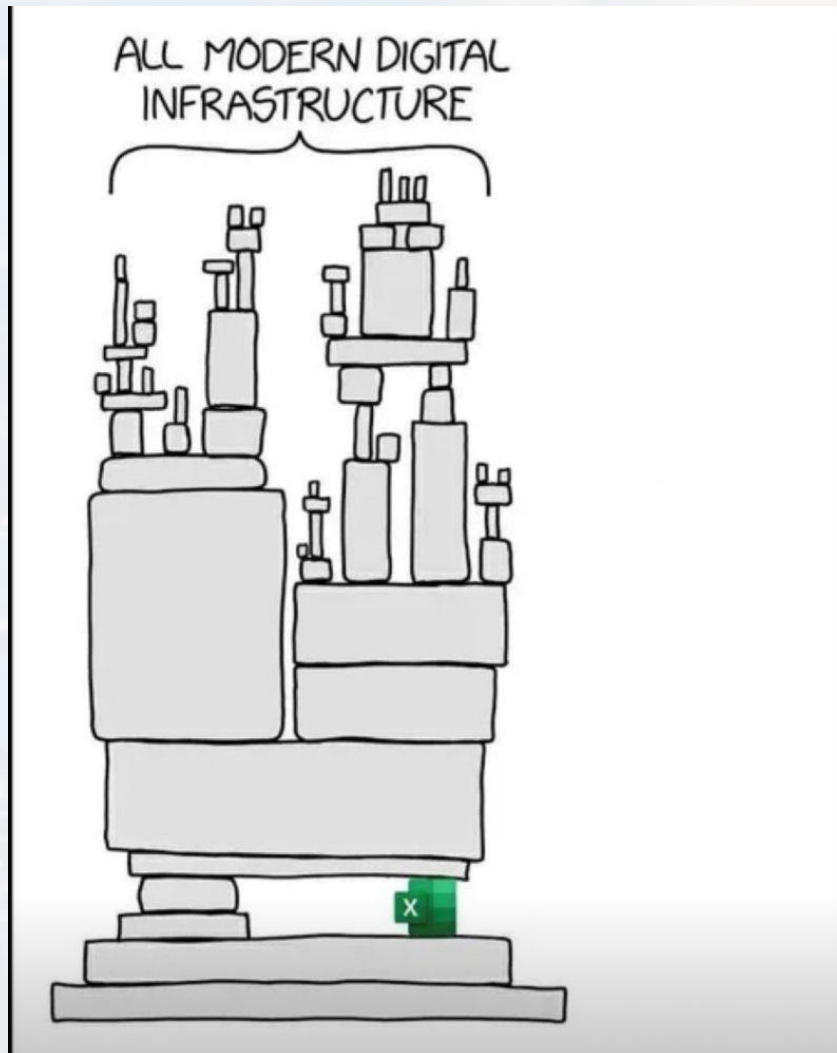
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checking, if integer  $N > 3$  is a prime number

```
N = 40
```

```
for n in range(3, N):
```

```
    result = N % n
```

```
    if result == 0:
        print('not prime')
```

```
not prime
not prime
not prime
not prime
not prime
```

it is sufficient to know for the first time if  $N$  is not prime

→ don't need to run the entire loop



checking, if integer  $N > 3$  is a prime number

```
N = 40
```

```
for n in range(3, N):
```

```
    result = N % n
```

```
    if result == 0:  
        print('not prime')
```

```
        break
```

interrupts loop immediately, if  
condition is true

not prime





checking, if integer  $N > 3$  is a prime number

Now we also want the code to print if **N is prime** too

```
N = 40
```

```
for n in range(3,N):
```

```
    result = N%n
```

```
    if result == 0:
```

```
        print('not prime')
```

```
        break
```

```
    else:
```

```
        print('is prime')
```

is prime

not prime

now says '*is prime*', **each time**  
N is not dividable without  
remainder



checking, if integer  $N > 3$  is a prime number

Now we also want the code to print if **N is prime** too

```
N = 40
```

```
for n in range(3, N):
```

```
    result = N % n
```

```
    if result == 0:
        print('not prime')
```

```
        break
```

```
    else:
```

```
        if n < N - 1:
```

```
            continue
```

```
        print('is prime')
```

skips the current iteration

N = 39 not prime

N = 40 not prime

N = 41 is prime



cleverer: **avoiding half of the iterations** in the first place:

```
if N > 1:
    for n in range(2, (N//2)+1):
        if (N % n) == 0:
            print(N, 'not prime')
            break
    else:
        print(N, 'is prime')
else:
    print(N, 'is not prime')
```





```
7 N = 41
8
9 if N > 1:
10
11
12
13
```

Syntax error before  
entering a statement.

Maybe you want to run  
the code without having  
written a statement!

```
7 N = 41
8
9 if N > 1:
10 ... pass
```

`pass` is a null statement:  
it matches the required  
syntax, but doesn't do  
anything, just a placeholder



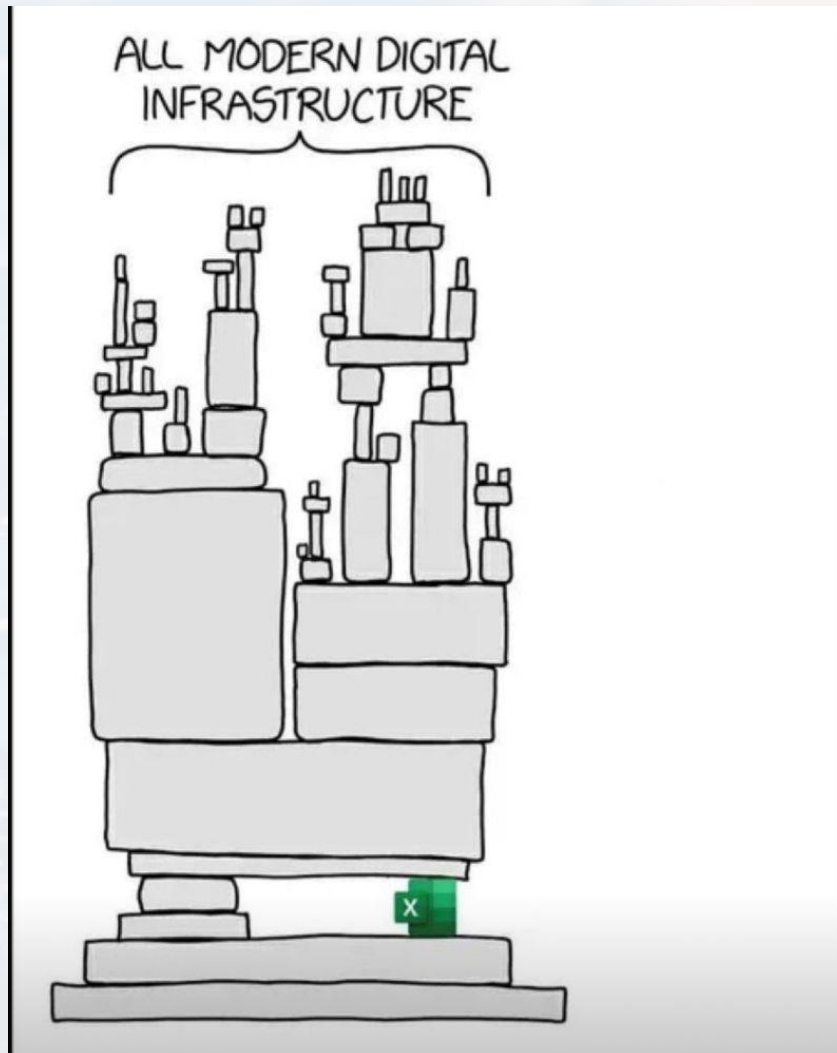
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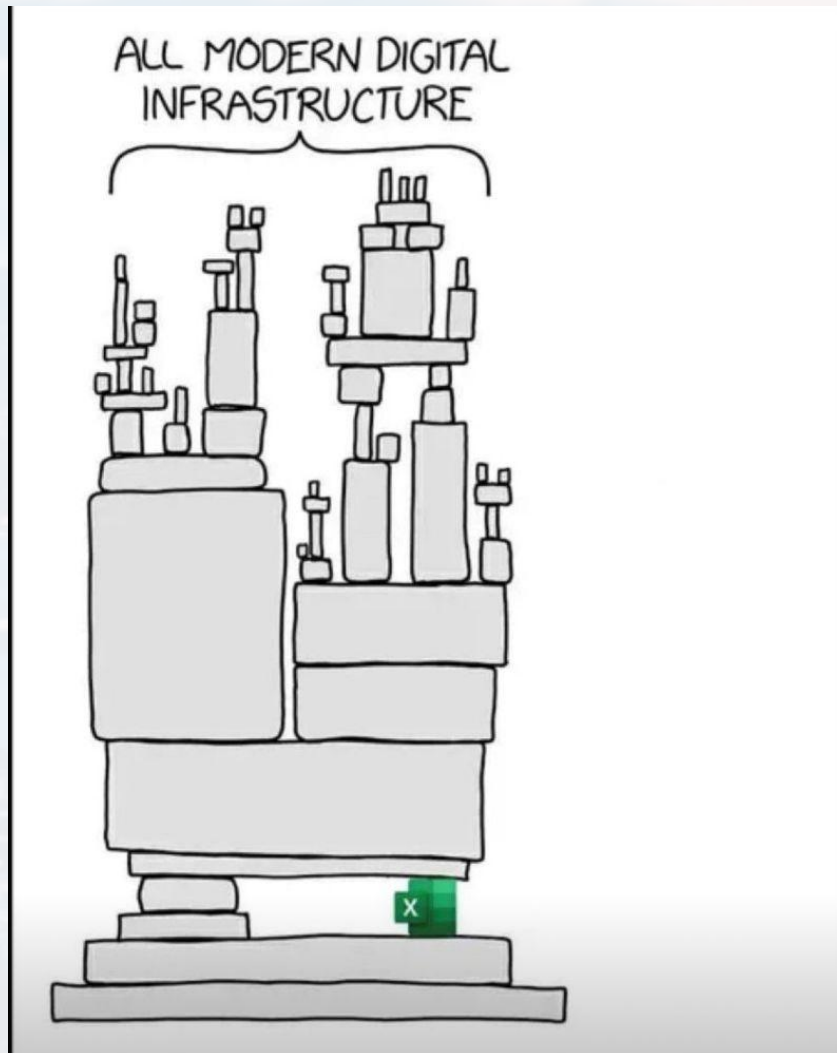
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loops (**comprehension**)

```
from math import *
```

```
Factorial = [factorial(n) for n in range(10)]
```

```
NT    = 'ACGT'  
Code = [[1,0,0,0],  
         [0,1,0,0],  
         [0,0,1,0],  
         [0,0,0,1]]
```

```
Dict = {nt: code for code, nt in zip(Code, NT)}
```

```
Dict['A']
```

```
In [2]: Dict['A']  
Out[2]: [1, 0, 0, 0]
```

Index ▲	Type	Size	
0	int	1	1
1	int	1	1
2	int	1	2
3	int	1	6
4	int	1	24
5	int	1	120
6	int	1	720
7	int	1	5040
8	int	1	40320
9	int	1	362880

What if we want to encode an entire sequence, say **'ACGGTCCGACCT'**?



```
NT    = 'ACGT'  
Code = [[1,0,0,0],  
        [0,1,0,0],  
        [0,0,1,0],  
        [0,0,0,1]]
```

```
Dict = {nt: code for code, nt in zip(Code, NT)}
```

one possibility: loop

```
S = 'ACGGTCCGACCT'  
L = []  
  
for s in S:  
    L += [Dict[s]]
```

[1, 0, 0, 0],
[0, 1, 0, 0],
[0, 0, 1, 0],
[0, 0, 1, 0],
[0, 0, 0, 1],
[0, 1, 0, 0],
[0, 1, 0, 0],
[0, 0, 1, 0],
[1, 0, 0, 0],
[0, 1, 0, 0],
[0, 1, 0, 0],
[0, 0, 0, 1]

What if we want to encode an entire sequence, say 'ACGGTCCGACCT'?

However, we wanted to avoid loops as much as possible



## benchmarking the loop:

However, we wanted to avoid loops as much as possible

```
import time
```

```
t1 = time.monotonic()
```

```
for i in range(100000):
```

```
    L = []
```

```
    for s in S:
```

```
        L += [Dict[s]]
```

```
t2 = time.monotonic()
```

```
dt = t2 - t1
```

```
print("Total runtime: " + str(dt) + ' seconds')
```

total runtime: 0.14s





```
S = 'ACGGTCCGACCT'
```

```
L = []
```

```
for s in S:
```

```
    L += [Dict[s]]
```

alternative: lambda

```
Encode = lambda Seq: [Dict[s] for s in Seq]
```

defines the sequence of commands the function has to execute

the input argument (name is arbitrary)

defining a function, we name Encode using the keyword lambda



```
S = 'ACGGTCCGACCT'
```

```
L = []
```

```
for s in S:
```

```
    L += [Dict[s]]
```

alternative: lambda

```
Encode = lambda Seq: [Dict[s] for s in Seq]
```

```
Encode(S) [[1, 0, 0, 0],  
           [0, 1, 0, 0],  
           [0, 0, 1, 0],  
           [0, 0, 1, 0],  
           [0, 0, 0, 1],  
           [0, 1, 0, 0],  
           [0, 1, 0, 0],  
           [0, 0, 1, 0],  
           [1, 0, 0, 0],  
           [0, 1, 0, 0],  
           [0, 1, 0, 0],  
           [0, 0, 0, 1]]
```

Once, we have defined Encode,  
we **don't need to run the loop**  
for every new sequence S1, S2, ...  
we just call the function

```
Encode(S1)
```

```
Encode(S2)
```

```
Encode(S3)
```



benchmarking lambda:

```
t1 = time.monotonic()

for i in range(100000):
    E = Encode(S)

t2 = time.monotonic()

dt = t2 - t1
print("Total runtime: " + str(dt) + ' seconds')
```

total runtime: 0.06s

vs loop total runtime: 0.14s





```
NT    = 'ACGT'          S = 'ACGGTCCGACCT'
Code  = [[1,0,0,0],
          [0,1,0,0],
          [0,0,1,0],
          [0,0,0,1]]
```

```
Dict = {nt: code for code, nt in zip(Code, NT)}
```

```
L = []
```

versus

```
for s in S:
    L += [Dict[s]]
```

```
Encode = lambda Seq: [Dict[s] for s in Seq]
```

```
Encode(S)
```

- **faster** (factor of 2)
- has to be defined **only once**
- named **“anonymous function”** (not stored in an extra file)



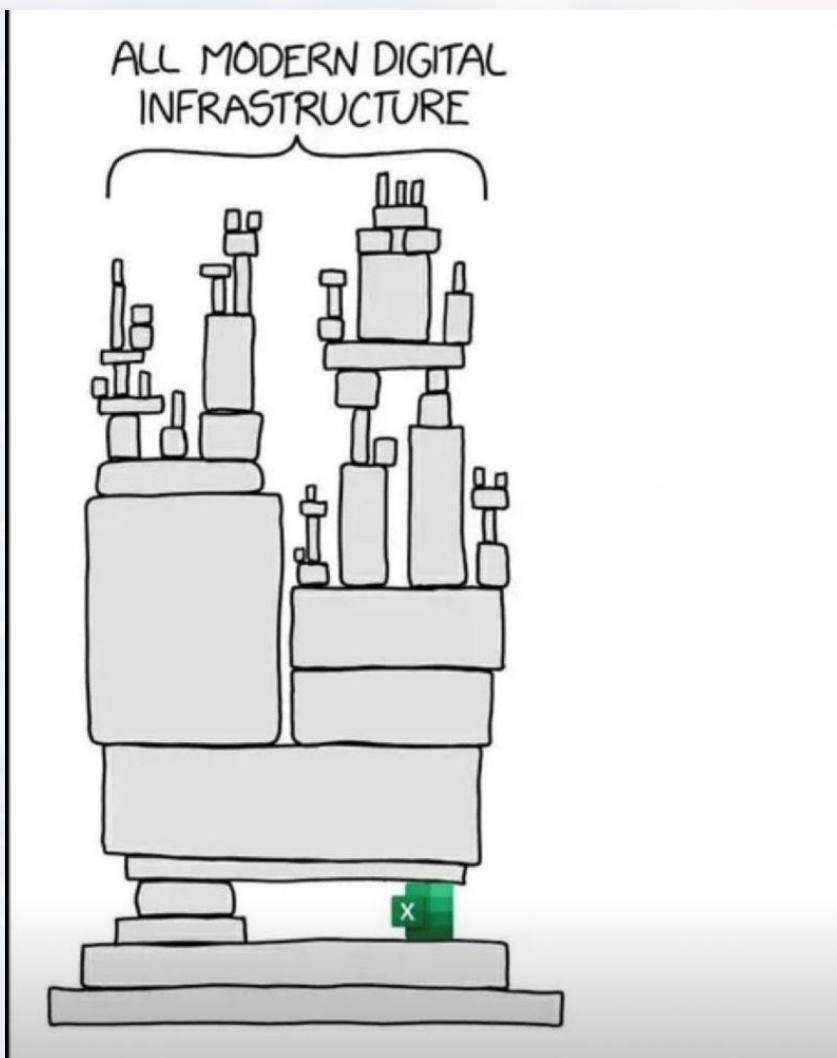
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- **map**
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Now we want to run **multiple sequences** most efficiently

S1 = 'ACGGTCCGACCT'

S2 = 'TTCAGGT'

S3 = 'ATCGGCAATCTGCTTCA'

S4 = 'CGTCCGTA'

Encode = lambda Seq: [Dict[s] for s in Seq]

as before, we could run a loop

S = [S1, S2, S3, S4]

L = []

```
for s in S:  
    L += [Encode(s)]
```

Index	Type	Size	Value
0	list	12	[[1, 0, 0, 0], [0, 1, 0, 0], [0, 0, 1, 0], [0, 0, 1, 0], [0, ...
1	list	7	[[0, 0, 0, 1], [0, 0, 0, 1], [0, 1, 0, 0], [1, 0, 0, 0], [0, ...
2	list	17	[[1, 0, 0, 0], [0, 0, 0, 1], [0, 1, 0, 0], [0, 0, 1, 0], [0, ...
3	list	8	[[0, 1, 0, 0], [0, 0, 1, 0], [0, 0, 0, 1], [0, 1, 0, 0], [0, ...





Now we want to run **multiple sequences** most efficiently

S1 = 'ACGGTCCGACCT'

S2 = 'TTCAGGT'

S3 = 'ATCGGCAATCTGCTTCA'

S4 = 'CGTCCGTA'

```
Encode = lambda Seq: [Dict[s] for s in Seq]
```

a more efficient way is using **map**

```
S = [S1, S2, S3, S4]
```

```
L = list(map(Encode, S))
```

**map** needs a **function** (here Encode) as first input argument and an **iteratable** - over which the function runs - as a second argument

finally, turning the map object into a list



Now we want to run **multiple sequences** most efficiently

S1 = 'ACGGTCCGACCT'

S2 = 'TTCAGGT'

S3 = 'ATCGGCAATCTGCTTCA'

S4 = 'CGTCCGTA'

Encode = `lambda Seq: [Dict[s] for s in Seq]`

a more efficient way is using `map`

S = [S1, S2, S3, S4]

L = `list(map(Encode, S))`

Index	Type	Size	Value
0	list	12	[[1, 0, 0, 0], [0, 1, 0, 0], [0, 0, 1, 0], [0, 0, 1, 0], [0, ...
1	list	7	[[0, 0, 0, 1], [0, 0, 0, 1], [0, 1, 0, 0], [1, 0, 0, 0], [0, ...
2	list	17	[[1, 0, 0, 0], [0, 0, 0, 1], [0, 1, 0, 0], [0, 0, 1, 0], [0, ...
3	list	8	[[0, 1, 0, 0], [0, 0, 1, 0], [0, 0, 0, 1], [0, 1, 0, 0], [0, ...



finally, we benchmark the **complete loop vs lambda/map**:

```
S1 = 'ACGGTCCGACCT'  
S2 = 'TTCAGGT'  
S3 = 'ATCGGCAATCTGCTTCA'  
S4 = 'CGTCCGTA'
```

```
S = [S1, S2, S3, S4]
```

```
t1 = time.monotonic()  
  
for i in range(100000):  
    for s in S:  
        L = []  
        for nt in s:  
            L += [Dict[nt]]
```

**total runtime: 0.58s**

```
t2 = time.monotonic()  
dt = t2 - t1  
  
print("Total runtime: " + str(dt) + ' seconds')
```





finally, we benchmark the **complete loop vs lambda/map**:

```
t1 = time.monotonic()
```

```
for i in range(100000):
```

```
    L = list(map(Encode, S))
```

```
t2 = time.monotonic()
```

```
dt = t2 - t1
```

```
print("Total runtime: " + str(dt) + ' seconds')
```

```
S1 = 'ACGGTCCGACCT'
```

```
S2 = 'TTCAGGT'
```

```
S3 = 'ATCGGCAATCTGCTTCA'
```

```
S4 = 'CGTCCGTA'
```

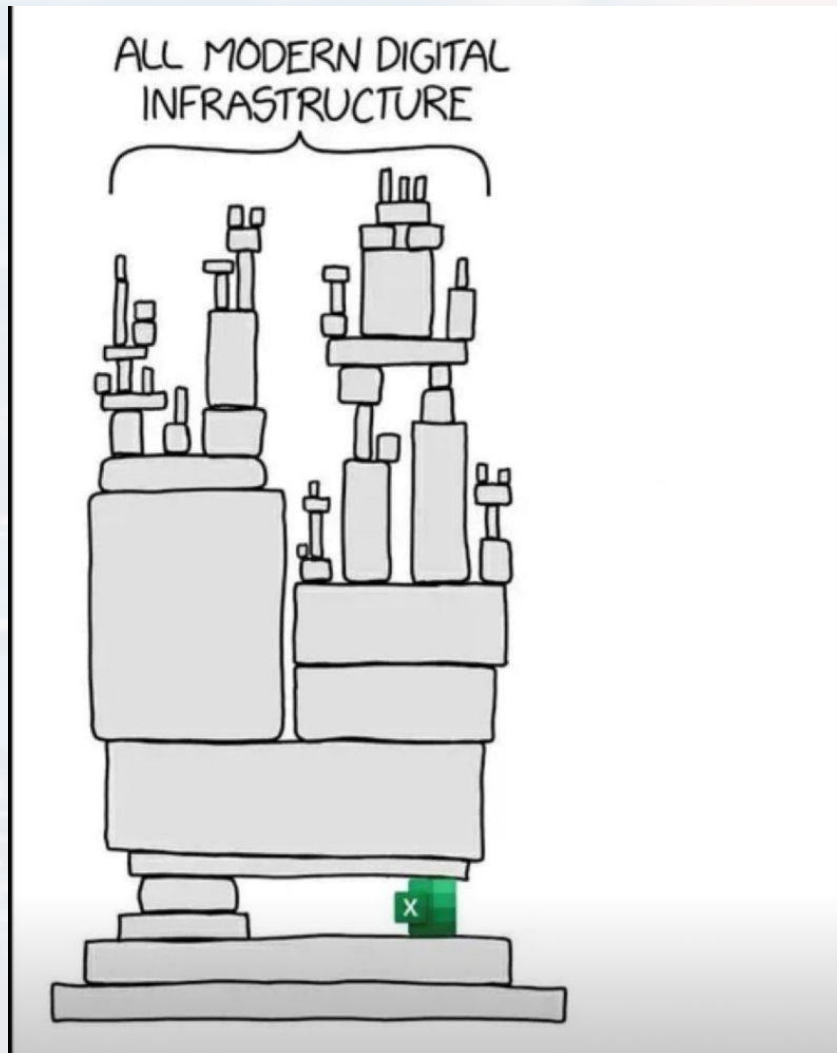
```
S = [S1, S2, S3, S4]
```

**total runtime: 0.22s**

We saved two nested loops and it is almost 3x faster!



## Outline



### Control Structures

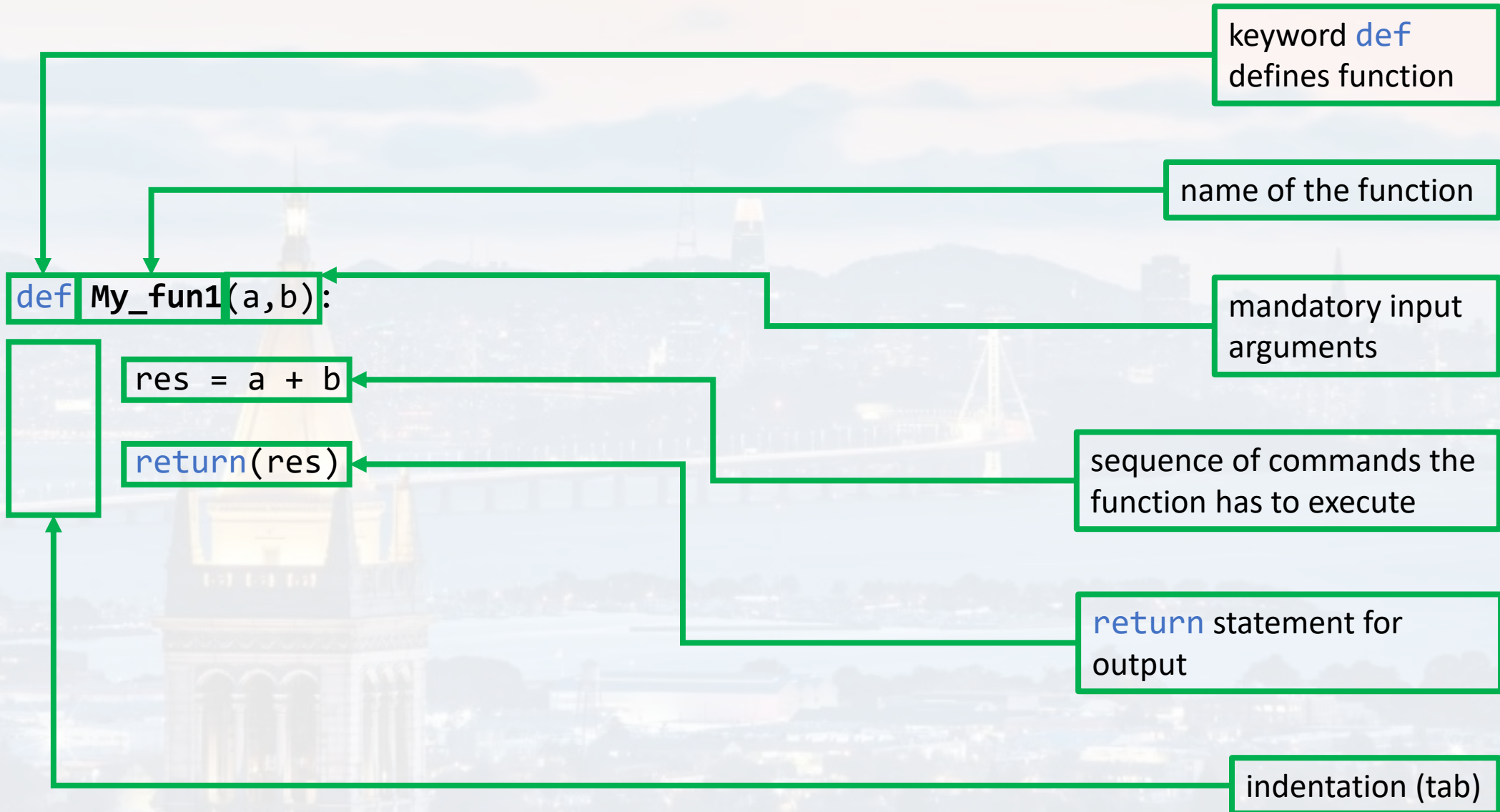
- General Idea and Structure
- for Loops and Comprehension
- if, else and elif
- while
- break, continue and pass

### Functions

- lambda
- map
- def
- \*args and \*\*kwargs



actual functions/methods in Python:







actual functions/methods in Python:

```
def My_fun1(a,b):
```

```
    res = a + b
```

```
    return(res)
```

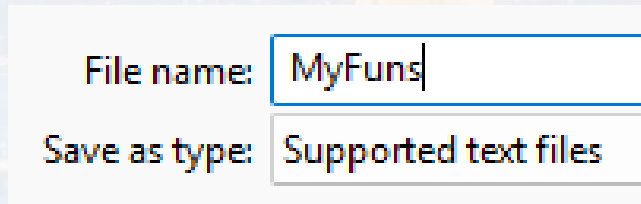
also called **body**  
of the function



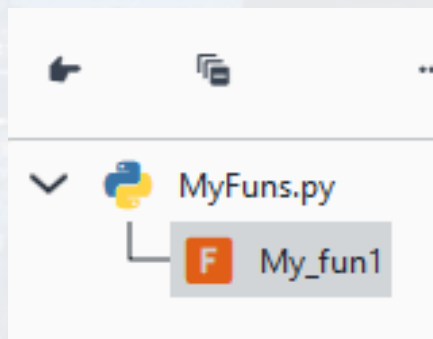
actual functions/methods in Python:

```
def My_fun1(a,b):  
  
    res = a + b  
  
    return(res)
```

```
8 def My_fun1(a,b):  
9     ....  
10     ....res = a + b  
11  
12     ....return(res)
```



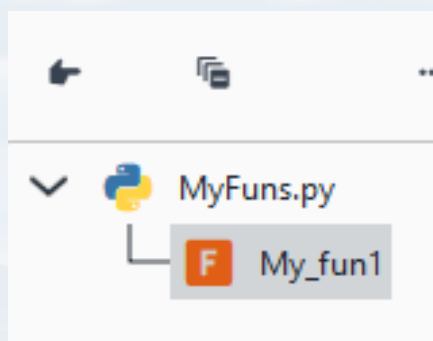
saving the .py script that contains My\_fun1 as MyFuns.py



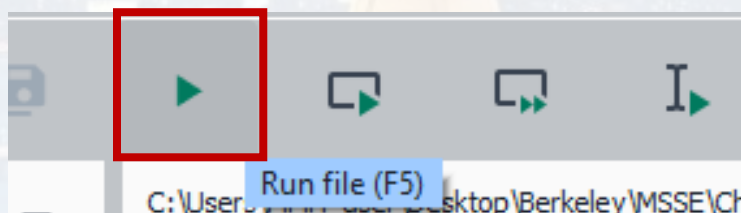
the .py script MyFuns.py contains My\_fun1



actual functions/methods in Python:



the .py script MyFuns.py contains My\_fun1



compiling the function (green arrow)

```
In [1]: runfile('C:/[redacted]/Berkeley/MSSE/Chem 272/05  
Functions/MyFuns.py', wdir='C:/[redacted]/Berkeley/MSSE/Chem  
272/05 Functions')
```





```
In [3]: My
```

```
My_fun1  
MyFuns.py
```

check via autocomplete if function is recognized

```
In [3]: My_fun1(
```

```
My_fun1(a, b)
```

```
No documentation available
```

autocomplete tells us that we need two mandatory input arguments: a and b

```
R = My_fun1(12, 10)
```

running the function and saving the output as variable R

```
In [4]: print(R)  
22
```



what can go wrong:

too **many** input arguments

```
In [6]: R = My_fun1(12,10,4)
Traceback (most recent call last):
```

```
Cell In[6], line 1
    R = My_fun1(12,10,4)
```

```
TypeError: My_fun1() takes 2 positional arguments but 3 were given
```

too **few** input arguments

```
In [8]: R = My_fun1(12)
Traceback (most recent call last):
```

```
Cell In[8], line 1
    R = My_fun1(12)
```

```
TypeError: My_fun1() missing 1 required positional argument: 'b'
```

```
def My_fun1(a,b):
```

```
    res = a + b
```

```
    return(res)
```



what can go wrong:

confusing **calling** the function vs **saving the function as a new variable**

```
R = My_fun1
```

```
def My_fun1(a,b):
```

```
    res = a + b
```

```
    return(res)
```

```
In [11]: print(R)
<function My_fun1 at 0x00000159837C3100>
```

function My\_fun1 is **copied** to R

→ will not prompt an error message

```
In [13]: type(R)
Out[13]: function
```

```
In [12]: R(2,3)
Out[12]: 5
```





what can go wrong:

confusing **calling** the function vs **saving the function as a new variable**

```
R = My_fun1()
```

function `My_fun1` needs no input argument

→ returns output to R

```
def My_fun1(a,b):
```

```
    res = a + b
```

```
    return(res)
```



what can go wrong:

when output is not stored in a new variable → generates output in console

```
In [15]: My_fun1(12,10)
Out[15]: 22
```

```
def My_fun1(a,b):
```

```
    res = a + b
```

```
    return(res)
```

calling **more output** variables then provided by function

```
[R1, R2] = My_fun1(12, 10)
```

```
In [16]: [R1, R2] = My_fun1(12,10)
Traceback (most recent call last):
```

```
Cell In[16], line 1
      [R1, R2] = My_fun1(12,10)
```

```
TypeError: cannot unpack non-iterable int object
```



generating multiple outputs

```
def My_fun1(a,b):  
  
    res1 = a + b  
    res2 = a * b  
    res3 = a**b  
  
    return res1, res2, res3
```

save and compile...

```
[R1, R2, R3] = My_fun1(5,6)
```

Nam▲	Type	Size	
R1	int	1	11
R2	int	1	30
R3	int	1	15625





generating multiple outputs

```
def My_fun1(a,b):  
  
    res1 = a + b  
    res2 = a * b  
    res3 = a**b  
  
    return res1, res2, res3
```

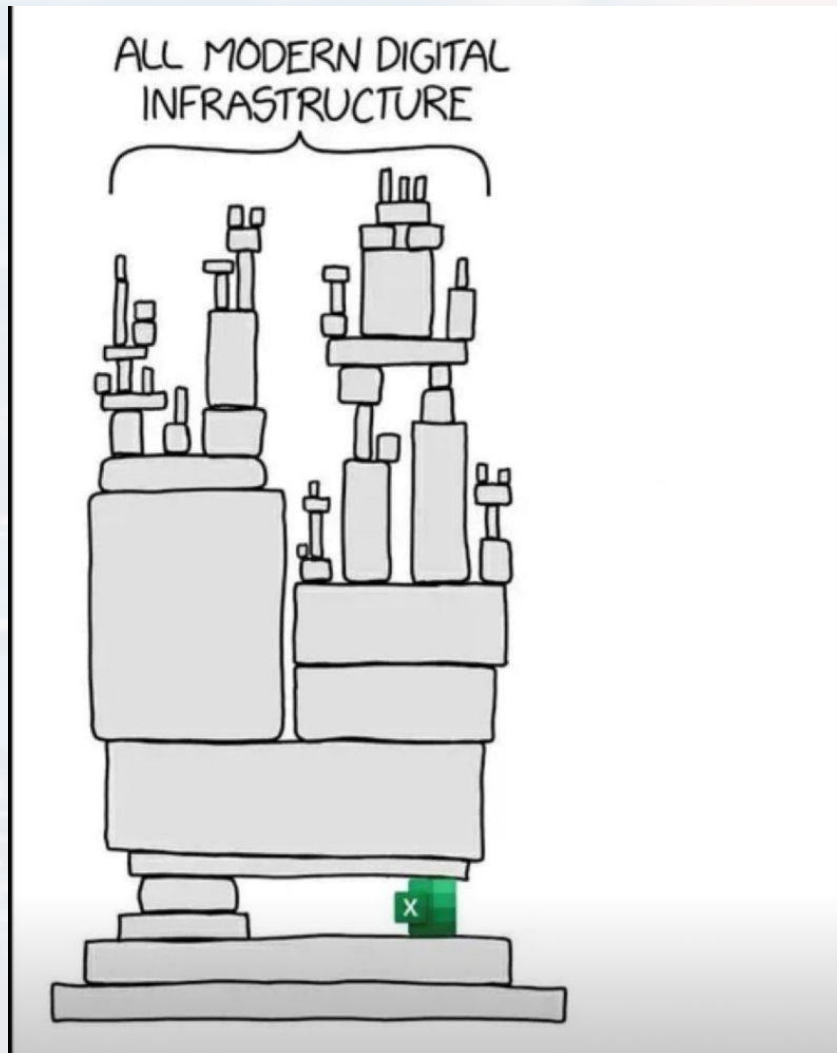
sometimes a function generates more output than we need  
→ using `_` for suppressing specific output

```
[_, R2, _] = My_fun1(5,6)
```

Nam▲	Type	Size	
R2	int	1	30



## Outline



### Control Structures

- General Idea and Structure
- for Loops and Comprehension
- if, else and elif
- while
- break, continue and pass

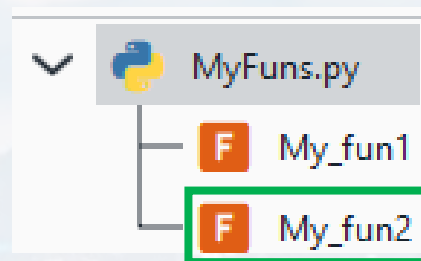
### Functions

- lambda
- map
- def
- **\*args** and **\*\*kwargs**



**default** arguments → specific value unless stated otherwise

```
def My_fun2(a, b = 2):  
  
    res1 = a + b  
    res2 = a * b  
    res3 = a**b  
  
    return res1, res2, res3
```



```
In [26]: My_fun2(5)  
Out[26]: (7, 10, 25)
```

```
In [27]: My_fun2(5,3)  
Out[27]: (8, 15, 125)
```



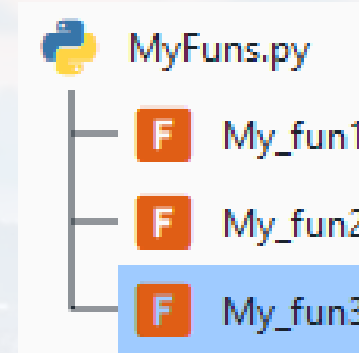


**optional** \*args arguments → when needed for specific settings

```
def My_fun3(a, b = 2, *power):  
    if power:  
        print(type(power))  
  
    res1 = a + b  
    res2 = a * b  
    res3 = a**b  
  
    return res1, res2, res3
```

```
[R1, R2, R3] = My_fun3(1, 2, 3)
```

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



Why is it a tuple?



**optional** \*args arguments → when needed for specific settings

## Why is it a tuple?

We switch to a better example:

```
def BuildSentences(*words):
```

```
    Sentence = ''
```

```
    for w in words:
```

```
        Sentence += ' ' + w
```

```
    print(Sentence)
```

iterating over the  
tuple words

adding as many  
words as given as  
input

```
In [41]: BuildSentences('This', 'is', 'a', 'sentence', '!')  
This is a sentence !
```

\*args → as many  
input arguments  
as we want!



better solution here:

```
def My_fun3(a, b = 2, power = 1):  
  
    res1 = a**power + b**power  
    res2 = a * b  
    res3 = a**b  
  
    return res1, res2, res3
```





optional keyword **\*\*kwargs** arguments

Let us first check the type:

```
def KWargExample(**test):  
    print(type(test))
```

```
KWargExample(test = 'this is a test')
```

```
In [46]: KWargExample(test = 'this is a test')  
<class 'dict'>
```

Why is it a dictionary?



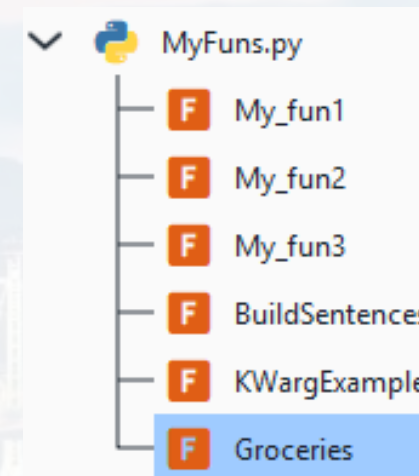
optional keyword **\*\*kwargs** arguments

Why is it a dictionary?

```
def Groceries(**items):  
    print(items)
```

```
Groceries(butter = '250g', beer = 20,  
          sausage = 'salami', wine = 'red')
```

```
{'butter': '250g', 'beer': 20, 'sausage': 'salami', 'wine': 'red'}
```



**\*\*kwargs** → as many  
input keyword  
arguments as we want!



optional keyword **\*\*kwargs** arguments

Why is it a dictionary?

```
def Groceries(**items):
```

```
    print(items)
```

```
Groceries(butter = '250g', beer = dict(IPA = 20, WheatBeer = 5),  
          sausage = 'salami', wine = 'red')
```

```
{'butter': '250g', 'beer': {'IPA': 20, 'WheatBeer': 5}, 'sausage': 'salami',  
'wine': 'red'}
```





examples in python:

```
plt.plot(|
    plot(*args: 'float | ArrayLike | str', scalex: 'bool' =
        True, scaley: 'bool' = True, data=None, **kwargs,)
    Plot y versus x as lines and/or markers.
    Call signatures::
    plot([x], y, [fmt], *, data=None, **kwargs)
    plot([x], y, [fmt], [x2], y2, [fmt2], ..., **kwargs)
    ...
```

plt.plot(x\_plot, y\_plot, 'k-', linewidth = 3, alpha = 0.5)

plotting x vs y:  
mandatory argument

optional: line color ( 'k' = black)  
and line style ( ' - ' = solid line)

key word arguments



**Thank you very much for your attention!**

