

# Business Data Mining

IDS 472 (Spring 2024)

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- **Simplicity & Readability** (along with many 3<sup>rd</sup>-party packages) have made Python the “go-to” programming language for ML
- Step 1: Install **Anaconda**
  - Anaconda is a data science platform that comes with many things that are required throughout the class
  - It comes with a Python distribution, a package manager known as **conda**, and many DS packages and libraries (NumPy, pandas, SciPy, scikit-learn, and Jupyter Lab/Notebook)
  - To install Anaconda, refer to [Python\\_Setup.pdf](#) on Blackboard

- Python is a programming language that is interpreted rather than compiled [[ChatGPT](#)]
  - We can run codes line-by-line
  - The IDE (integrated development environment) of choice in this class is **Jupyter lab** or **Jupyter notebook**
  - Using Jupyter Lab allows us to write and run codes, and combine them with text and graphics
  - Once Anaconda is installed, we can launch Jupyter lab either from Anaconda Navigator panel or from terminal
  - All materials for this class are developed in Jupyter lab

- In a Jupyter notebook, everything is part of *cells*
- *Code* and *markdown* (text) cells are the most common cells

```
2 + 5
```

7

```
x = 2.2    # this is a comment (use "#" for comments)
y = 2
x * y
```

4.4

```
x = 1      # an integer
x = 0.3     # a floating-point
x = 'what a nice day!' # a string
x = True    # a boolean variable (True or False)
x = None    # None type (the absence of any value)
```

- Python variables are **references**!
  - An assignment statement such as `x = 1` creates a reference `x` to a memory location storing object `1`
  - Types are attached to the objects on the right, not to the variable name on the left
  - We can see the type of a variable by `type()` method

```
x = 3.3
display(type(x))
x = True
display(type(x))
x = None
display(type(x))
```

- A **string** is a sequence of characters

```
string1 = 'This is a string'  
print(string1)  
string2 = "Well, this is 'string' too!"  
print(string2)  
string3 = 'Johnny said: "How are you?"'  
print(string3)
```

- Concatenating strings can be done using (+) operator

```
string3 = string1 + ". " + string2  
print(string3)
```

This is a string. Well, this is 'string' too!

- Use `\t` and `\n` to add **tab** and **newline** characters to a string

```
print("Here we use a newline\n to go to the next\t line")
```

Here we use a newline  
to go to the next            line

# Some Important Operators

- The following expressions include arithmetic operators in Python:

```
x = 5
y = 2
print(x + y)    # addition
print(x - y)    # subtraction
print(x * y)    # multiplication
print(x / y)    # division
print(x // y)   # floor division (removing fractional parts)
print(x % y)    # modulus (integer remainder of division)
print(x ** y)   # x to the power of y
```

- The following expressions include relational and logical operators:

```
print(x < 5)    # less than (> is greater than)
print(x <= 5)   # less than or equal to (>= is greater than or equal to)
print(x == 5)   # equal to
print(x != 5)   # not equal to
print((x > 4) and (y < 3)) # "and" keyword is used for logical and (it_
    ↳ is highlighted to be distinguished from other texts)
print((x < 4) or (y > 3))  # "or" keyword is used for logical or
print(not (x > 4))         # "not" keyword is used for logical not
```

# Membership Operators

- Membership operator is used to check whether an element is present within a collection of data item
- By collection, we refer to ordered or unordered data structures such as **string**, **lists**, **sets**, **tuples** & **dictionaries**

```
print('Hello' in 'HelloWorlds!') # 'HelloWorlds!' is a string and 'Hello'
    ↪ is part of that
print('Hello' in 'HelloWorlds!')
print(320 in ['Hi', 320, False, 'Hello'])
```

True

False

True



- Python has a number of built-in data structures that are used to store multiple data items as separate entries
- The most basic collection is a *list*, which is used to store a sequence of objects (*ordered*)
- It is created by a sequence of *comma-separated* objects within [ ]

```
x = [5, 3.0, 10, 200.2]
x[0]  # the index starts from 0
```

```
x = ['JupyterNB', 75, None, True, [34, False], 2, 75] # observe that_
↪ this list contains another list
x[4]
```

- Lists are *mutable*: they can be modified after they are created

```
x[4] = 52 # here we change one element of list x
x
```

```
['JupyterNB', 75, None, True, 52, 2, 75]
```

- We can use a number of functions and methods with a list:

```
len(x) # here we use a built-in function to return the length of a list
```

```
y = [9, 0, 4, 2]
print(x + y) # to concatenate two lists, + operator is used
print(y * 3) # to concatenate multiple copies of the same list, *
               ↪ operator is used
```

```
z = [y, x] # to nest lists to create another list
z
```

- We can use *indexing* to access an element within a list

```
x[3]
```

True

- To access the elements of nested lists (list of lists), we need to separate indices with square brackets

```
z[1][0] # this way we access the second element within z and within  
↪ that we access the first element
```

'JupyterNB'

- A negative index has a meaning

```
x[-1] # index -1 returns the last item in the list; -2 returns the  
↪ second item from the end, and so forth
```

- *Slicing* is used to access multiple elements in the form of a sub-list: use a colon (:) to specify the start point (*inclusive*) and end point (*non-inclusive*)

```
x[0:4] # the last element seen in the output is at index 3
```

```
x[:4] # equivalent to x[0:4]
```

```
['JupyterNB', 75, None, True]
```

```
x[4:]
```

```
[52, 2, 75]
```

```
print(x)
```

```
x[-2:]
```

```
['JupyterNB', 75, None, True, 52, 2, 75]
```

```
[2, 75]
```

- Another useful type of slicing is using `[start:stop:stride]` syntax, where the `stride` is the step size

```
x[0:4:2] # steps of 2
```

```
['JupyterNB', None]
```

```
x[4::-2] # a negative step returns items in reverse (it works backward_
↳so here we start from the element at index 4 and go backward to the_
↳beginning with steps of 2)
```

```
[52, None, 'JupyterNB']
```

- Modifying elements in a list

```
x.append(-23) # to append a value to the end of the list
x
```

```
['JupyterNB', 75, None, True, 52, 2, 75, -23]
```

```
x.remove(75) # to remove the first matching element
x
```

```
['JupyterNB', None, True, 52, 2, 75, -23]
```

```
y.sort() # to sort the element of y
y
```

```
[0, 2, 4, 9]
```

```
x.insert(2, 10) # insert(pos, elmnt) method inserts the specified elmnt_
↳ at the specified position (pos) and shift the rest to the right
x
```

```
['JupyterNB', None, 10, True, 52, 2, 75, -23]
```

```
print(x.pop(3)) # pop(pos) method removes (and returns) the element at_
↳ the specified position (pos)
x
```

True

```
['JupyterNB', None, 10, 52, 2, 75, -23]
```

```
del x[1] # del statement can also be used to delete an element from a  
        ↪ list by its index
```

x

```
['JupyterNB', 10, 52, 2, 75, -23]
```

```
x.pop() # by default the position is -1, which means that it removes  
        ↪ the last element
```

x

```
['JupyterNB', 10, 52, 2, 75]
```

- **Copying a list:** it is often desired to make a copy of a list and work with it without affecting the original list
- If we simply use the assignment operator, we end up changing the original list!

```
list1 = ['A+', 'A', 'B', 'C+']
```

```
list2 = list1  
list2
```

```
['A+', 'A', 'B', 'C+']
```

```
list2.append('D')  
print(list2)  
print(list1)
```

```
['A+', 'A', 'B', 'C+', 'D']  
['A+', 'A', 'B', 'C+', 'D']
```

- When we write `list2 = list1`, what happens internally is that variable `list2` will point to the same container as `list1`



- There are three simple ways to properly copy the elements of a list
  - 1) *slicing*
  - 2) `copy()` method
  - 3) `list()` constructor
- They all create *shallow* copies of a list (in contrast with *deep* copies)

A shallow copy of a compound object such as list creates a new compound object and then adds references (to the objects found in the original object) into it. A deep copy of a compound object creates a new compound object and then adds *copies* of the objects found in the original object.

```
list3 = list1[:] # the use of slicing; that is, using [:] we make a  
    ↪ shallow copy of the entire list1  
list3.append('E')  
print(list3)  
print(list1)
```

```
list4 = list1.copy() # the use of copy() method  
list4.append('E')  
print(list4)  
print(list1)
```

```
list5 = list(list1) #the use of list() constructor  
list5.append('E')  
print(list5)  
print(list1)
```

- **Tuple** is another data-structure that can hold other arbitrary data types
- A tuple is *immutable*: once it's created, its size and contents cannot be changed

```
tuple1 = ('Machine', 'Learning', 'with', 'Python', '1.0.0')  
tuple1
```

```
('Machine', 'Learning', 'with', 'Python', '1.0.0')
```

```
tuple1[0]
```

```
'Machine'
```

```
tuple1[:2]
```

```
('Machine', 'with', '1.0.0')
```

```
len(tuple1) # the use of len() to return the length of tuple
```

- An error is raised if we try to change the content of a tuple

```
tuple1[0] = 'Jupyter' # Python does not permit changing the value
```

```
TypeError                                Traceback (most recent call_
↳last)
/var/folders/vy/894wbsn11db_lqf17ys9fvdm0000gn/T/ipykernel_51384/
↳877039090.py in <module>
----> 1 tuple1[0] = 'Jupyter' # Python does not allow us to change the_
↳value

TypeError: 'tuple' object does not support item assignment
```

- There is no `append` or `remove` method for tuples

- We could redefine the entire tuple

```
tuple1 = ('Jupyter', 'NoteBook') # redefine tuple1  
tuple1
```

('Jupyter', 'NoteBook')

- We can concatenate them to create new tuples

```
tuple2 = tuple1 + ('Good', 'Morning')  
tuple2
```

('Jupyter', 'NoteBook', 'Good', 'Morning')

- A common use of tuples is in functions that return multiple values
  - `modf()` function from `math` module returns a two-item tuple including the fractional and integer parts of its input

```
from math import modf    # more on "import" later. For now just read_
    ↳ this as "from math module, import modf function" so that modf_
    ↳ function is available in our program
```

```
a = 56.5
```

```
modf(a) # the function is returning a two-element tuple
```

```
(0.5, 56.0)
```

- Sequence unpacking:

```
x, y = modf(a)
```

```
print("x = " + str(x) + "\n" + "y = " + str(y))
```

```
x = 0.5
```

```
y = 56.0
```

- A sequence of **comma separated** objects without paratheses is packed into a tuple

```
tuple1 = 'Machine', 'Learning', 'with', 'Python', '1.0.0' # sequence_
↪ packing
tuple1
```

```
('Machine', 'Learning', 'with', 'Python', '1.0.0')
```

```
x, y, z, v, w = tuple1 # the use of sequence unpacking
print(x, y, z, v, w)
```

Machine Learning with Python 1.0.0

- Multiple assignment and unpacking with lists

```
x, y, z, v, w = 'Machine', 'Learning', 'with', 'Python', '1.0.0'  
print(x, y, z, v, w)
```

Machine Learning with Python 1.0.0

```
list6 = ['Machine', 'Learning', 'with', 'Python', '1.0.0']  
x, y, z, v, w = list6  
print(x, y, z, v, w)
```

Machine Learning with Python 1.0.0

- To create a one-element tuple, the comma is required

```
tuple3 = 'Machine', # remove the comma and see what would be the type_  
↪ here  
type(tuple3)
```



- A **dictionary** is a useful data structure that contains a set of **values**, where each value is labeled by a unique **key**
- Dictionaries are created using a collection of **key:value** pairs wrapped within { } and are **non-ordered**

```
dict1 = {1:'value for key 1', 'key for value 2':2, (1,0):True, False:  
    ↳ [100,50], 2.5:'Hello'}  
dict1
```

```
{1: 'value for key 1',  
 'key for value 2': 2,  
 (1, 0): True,  
 False: [100, 50],  
 2.5: 'Hello'}
```

```
dict1['key for value 2']
```

```
dict1['key for value 2'] = 30 # change an element  
dict1
```

```
{1: 'value for key 1',  
 'key for value 2': 30,  
 (1, 0): True,  
 False: [100, 50],  
 2.5: 'Hello'}
```

```
dict1[10] = 'Bye'  
dict1
```

```
{1: 'value for key 1',  
 'key for value 2': 30,  
 (1, 0): True,  
 False: [100, 50],  
 2.5: 'Hello',  
 10: 'Bye'}
```

- `del` statement can be used to remove a key:value pair

```
del dict1['key for value 2']  
dict1
```

```
{1: 'value for key 1',  
 (1, 0): True,  
 False: [100, 50],  
 2.5: 'Hello',  
 10: 'Bye'}
```

- A key can not be a mutable object such as list

```
dict1[['1','(1,0)']] = 100 # list is not allowed as the key
```

```
TypeError                                Traceback (most recent call_  
  ↳ last)  
/var/folders/vy/894wbsn11db_lqf17ys9fvd00000gn/T/ipykernel_71178/  
  ↳ 1077749807.py in <module>  
----> 1 dict1[['1','(1,0)']] = 100 # list is not allowed as the key  
  
TypeError: unhashable type: 'list'
```

- To check the membership among keys, we use the `keys()` method to return a `dict_keys` object

```
(1,0) in dict1.keys()
```

True

```
(1,0) in dict1 # equivalent to: in dict1.keys()
```

- To check the membership among values, use the `values()` method to return a `dict_values` object

```
"Hello" in dict1.values()
```

True

- Another common way to create a dictionary is to use the `dict()` constructor

```
dict2 = dict([('Police', 102), ('Fire', 101), ('Gas', 104)])  
dict2
```

```
{'Police': 102, 'Fire': 101, 'Gas': 104}
```

```
dict3 = dict(Country='USA', phone_numbers=dict2, population_million=18.7)  
↪7) # the use of keywords arguments = object  
dict3
```

```
{'Country': 'USA',  
 'phone_numbers': {'Police': 102, 'Fire': 101, 'Gas': 104},  
 'population_million': 18.7}
```

- Sets are collections of non-ordered unique and immutable objects

```
set1 = {'a', 'b', 'c', 'd', 'e'}  
set1
```

```
set2 = {'b', 'b', 'c', 'f', 'g'}  
set2 # observe that the duplicate entry is removed
```

- They support union, intersection, difference, and symmetric difference

```
set1 | set2 # union using an operator. Equivalently, this could be done  
↳ by set1.union(set2)
```

```
{'a', 'b', 'c', 'd', 'e', 'f', 'g'}
```

```
set1 & set2 # intersection using an operator. Equivalently, this could  
↳ be done by set1.intersection(set2)
```

```
{'b', 'c'}
```

```
set1 ^ set2 # symmetric difference: elements only in one set, not in  
↳ both. Equivalently, this could be done by set1.  
↳ symmetric_difference(set2)
```

```
{'a', 'd', 'e', 'f', 'g'}
```

```
'b' in set1 # check membership
```

True

- We can use `help()` to see a list of all available set operations

```
help(set1) # output not shown
```

- In the following example, variable `y` becomes a list of 'Learning' and 'with'

```
x, *y, v, w = ['Machine', 'Learning', 'with', 'Python', '1.0.0']  
print(x, y, v, w)
```

```
Machine ['Learning', 'with'] Python 1.0.0
```

- Here `*` is working as an operator of implement *extended iterable unpacking*
- Any list or tuple is an iterable object
- We may use `*` right before an iterable in which case the iterable is expanded into a sequence of items



- Here is an example in which `*` operates on an iterable (a list), but at the site of unpacking, we create a tuple

```
*[1,2,3], 5
```

```
(1, 2, 3, 5)
```

- Here is a similar example: the 2<sup>nd</sup> iterable is a list

```
[*[1,2,3], 5]
```

```
[1, 2, 3, 5]
```

- Create a set

```
{*[1,2,3], 5}
```

```
{1, 2, 3, 5}
```

# Sequence Unpacking

- The following example raises an **error**

```
*[1,2,3]
```

```
File "/var/folders/vy/894wbsn11db_lqf17ys9fvd0000gn/T/ipykernel_71178/386627056.py", line 1
```

```
    *[1,2,3]  
    ^
```

```
SyntaxError: can't use starred expression here
```

- Iterable unpacking can be only used in certain places
- It can be used inside a list, tuple, or set
- It can be also used in *list comprehension* (discussed later) and inside function definitions and calls

- `*` is a “catch-all” operator

```
x, *y, v, w = ('Machine', 'Learning', 'with', 'Python', '1.0.0')  
print(x, y, v, w)
```

```
Machine ['Learning', 'with'] Python 1.0.0
```

- To create an output as before, use again `*` before `y` in the print function

```
print(x, *y, v, w)
```

```
Machine Learning with Python 1.0.0
```

- `for` loop statement allows us to loop over any *iterable* object
  - an iterable is any object capable of returning its members one at a time
  - list, string, tuple, sets, dictionaries are iterable objects
- For example, to iterate over a list:

```
for x in list1:  
    print(x)
```

A+

A

B

C+

D

- Iterate over a string:

```
string = "Hi There"  
for x in string:  
    print(x, end = "") # to print on one line one after another
```

Hi There

- Iterate over a dictionary:

```
dict2 = {1:"machine", 2:"learning", 3:"with python"}  
for key in dict2: # looping through keys in a dictionary  
    val = dict2[key]  
    print('key =', key)  
    print('value =', val)  
    print()
```

- Equivalently, we can replace `dict2` with `dict2.keys()` and achieve the same result:

```
dict2 = {1:"machine", 2:"learning", 3:"with python"}  
for key in dict2.keys(): # looping through keys in a dictionary  
    val = dict2[key]  
    print('key =', key)  
    print('value =', val)  
    print()
```

```
key = 1  
value = machine
```

```
key = 2  
value = learning
```

```
key = 3  
value = with python
```

- When looping through a dictionary, we can use the `items()` method to fetch the keys and values at the same time

```
for key, val in dict2.items():  
    print('key =', key)  
    print('value =', val)  
    print()
```

- Iterate over a sequence of numbers:

```
for i in range(3,8): # the sequence from 3 to 7  
    print('i =', i)
```

i = 3

i = 4

i = 5

i = 6

i = 7

- When looping through a sequence, we can use `enumerate(iterable, start=0)` to fetch the indices and their corresponding values at the same time

```
for i, v in enumerate(list6):  
    print(i, v)
```

```
0 Machine  
1 Learning  
2 with  
3 Python  
4 1.0.0
```

- Start the count from 1

```
for i, v in enumerate(list6, start=1):  
    print(i, v)
```



- The `zip()` function creates an iterator that aggregates two or more iterables, and then loops over this iterator

```
list_a = [1,2,3,4]
list_b = ['a','b','c','d']
for item in zip(list_a,list_b):
    print(item)
```

```
(1, 'a')
(2, 'b')
(3, 'c')
(4, 'd')
```

- We can now use `dict()` and `zip` to create a dictionary where keys are names and values are numbers

```
name_list = ['John', 'James', 'Jane']
phone_list = [979, 797, 897]
dict3 = dict(zip(name_list, phone_list)) # it works because here we use
    ↪ zip on two lists; therefore, each element of the iterable has two
    ↪ objects
dict3
```

```
{'John': 979, 'James': 797, 'Jane': 897}
```

- Once we have an iterable, it's often required to perform three operations:
  - select some elements that meet some conditions
  - perform some operations on every element
  - perform some operations on some elements that meet some conditions
- Python has an idiomatic way of doing these, known as *list comprehension* (*listcomps*)
- Create a list containing square of odd numbers between 1 to 20:

```
list_odd = [] # start from an empty list
for i in range(1, 21):
    if i%2 !=0:
        list_odd.append(i**2)

list_odd
```

```
[1, 9, 25, 49, 81, 121, 169, 225, 289, 361]
```

- List comprehension allows us to combine all this code in one line by combining the list creation, appending, the for loop, and the condition:

```
list_odd_lc = [i**2 for i in range(1, 21) if i%2 !=0]
list_odd_lc
```

```
[1, 9, 25, 49, 81, 121, 169, 225, 289, 361]
```

- Use the listcomps to generate a list of two-element tuples of non-equal integers between 0 and 3:

```
list_non_equal_tuples = [(x, y) for x in range(3) for y in range(3) if
    ↪ x != y]
list_non_equal_tuples
```

```
[(0, 1),
 (0, 2),
 (1, 0),
 (1, 2),
 (2, 0),
 (2, 1)]
```

- **Conditional statements** can be implemented by `if-elif-else` **statement**:

```
list4 = ["Machine", "Learning", "with", "Python"]
if "java" in list4:
    print("There is java too!")
elif "C++" in list4:
    print("There is C++ too!")
else:
    print("Well, just Python there.")
```

Well, just Python there.

- **Functions** are blocks of code that are named and do a specific job
- We can define a function using `def` keyword

```
def subtract_three_numbers(num1, num2, num3):  
    result = num1 - num2 - num3  
    return result
```

```
x = subtract_three_numbers(10, 3.0, 1)  
print(x)
```

6.0

```
x = subtract_three_numbers(num3 = 1, num1 = 10, num2 = 3.0)  
print(x)
```

6.0

- In Python functions, we can return any data type such as **lists**, **tuples**, **dictionaries**, etc
- We can also `return` multiple values, packed into one tuple

```
def string_func(string):  
    return len(string), string.upper(), string.title()
```

```
string_func('coolFunctions') # observe the tuple
```

```
(13, 'COOLFUNCTIONS', 'Coolfunctions')
```

```
x, y, z = string_func('coolFunctions') # unpacking  
print(x, y, z)
```

```
13 COOLFUNCTIONS Coolfunctions
```

- If we pass an object to a function and within the function the object is modified, the changes will be **permanent**

```
def list_mod(inp):  
    inp.insert(1, 'AB')  
  
list7 = [100, 'ML', 200]  
list_mod(list7)  
list7 # observe that the changes within the function appears outside_  
      ↪ the function
```

```
[100, 'AB', 'ML', 200]
```

- Sometimes we do not know in advance how many **positional** or **keyword arguments** should be passed to the function
- Use **\*** or **\*\*** before a `parameter_name`

- Define a function that receives the amount of money we can spend for grocery, and the name of items we need to buy
- The function prints the amount of money with a message as well as a capitalized acronym made out of items in the grocery list
- As we do not know in advance how many items we need to buy, the function should work with an arbitrary number of items in the grocery list
- Parameter accepting arbitrary number of arguments should appear last in the function definition



```
def grocery_to_do(money, *grocery_items): #the use of * before_  
    ↪ grocery_items is to allow an arbitrary number of arguments  
    acronym = ''  
    for i in grocery_items:  
        acronym += i[0].title()  
    print('You have {}$'.format(money)) # this is another way to write_  
    ↪ "print('You have ' + str(money) + '$')" using place holder {}  
    print('Your acronym is', acronym)  
  
grocery_to_do(40, 'milk', 'bread', 'meat', 'tomato')
```

You have 40\$

Your acronym is MBMT

- As we develop our programs, it is more convenient to put functions into a separate file called *module*, and then *import* them when they are needed
  - *importing* a module within a code makes the content of the module available in that program
  - modules can store multiple classes and variables
  - to create a module, we can put the definition of functions in a file with extension *.py*
- We will see plenty of examples when we use existing Python packages and modules to conduct different machine learning tasks