CS677 - Data Science with Python

Python Essentials - Review

Functions

```
In [1]:
         def greet(name, className):
             print("Hello " + name + ", Welcome to " + className)
In [2]:
         greet('John', 'CS677')
         Hello John, Welcome to CS677
In [3]:
         greet('Jane', 'CS521')
         Hello Jane, Welcome to CS521
In [4]:
         print(greet('Jane', 'CS521'))
         Hello Jane, Welcome to CS521
         None
In [5]:
         def greet(name, className):
             return ("Hello " + name + ", Welcome to " + className)
In [6]:
         print(greet('Jane', 'CS521'))
         Hello Jane, Welcome to CS521
```

Strings

```
In [7]:
          s1 = 'programming'
          s2 = "programming"
          s3 = '''program
              ming'''
          print(s1)
          print(s2)
          print(s3)
          programming
programming
          program
              ming
In [8]:
          print(len(s1))
          print(len(s2))
          print(len(s3))
          11
          11
16
```

Strings - Indexing and slicing

```
In [9]:
         s1 = 'programming'
         print(s1)
         print(s1[0])
         print(s1[0:1])
         print(s1[-1])
         print(s1[0:7])
         print(s1[0:-4])
         print(s1[:7])
         print(s1[3:-4])
         print(s1[3:7])
         print(s1[3:])
         programming
p
p
g
         program
         program
         program
         gram
         gram
         gramming
```

Strings - Skip slicing

```
In [10]: s1 = 'abcdefghijk'
    print(s1[::2])

    print(s1[:7:2])
    print(s1[4::2])

    print(s1[::-1])
    print(s1[::-2])

abcdefghijk
    acegik
    aceg
    egik
    kjihgfedcba
    kigeca
```

Strings are Immutable

Strings - Concatenation Operators + and *

```
In [12]: s1 = 'Data'
s2 = 'Science'
print(s1 + s2)
print(s1 + ' ' + s2)

print(2 * s1)
print(s2 * 3)

print(2 * (s1 + s2))
```

DataScience
Data Science
DataData
ScienceScienceScience
DataScienceDataScience

Strings - membership

Strings - Iterating

```
In [15]: s = 'Python'
    for letter in s:
        print(letter, ord(letter))

P 80
    y 121
    t 116
    h 104
    o 111
    n 110
```

Strings - other methods

```
In [16]:
         s = 'PyThon is Fun'
          print(s)
          print("capitalize:", s.capitalize())
          print("lower:", s.lower())
          print("upper:", s.upper())
          print("title:", s.title())
          print("swapcase:", s.swapcase())
          print("split:", s.split())
          print("list:", list(s))
          print("find:", s.find('is'))
          print("find:", s.find('n'))
          print("find:", s.find('n', 6))
          print("find:", s.find('n', -1))
          print("find:", s.find('a'))
         PyThon is Fun
         capitalize: Python is fun
         lower: python is fun
         upper: PYTHON IS FUN
         title: Python Is Fun
         swapcase: pYtHON IS fUN
         split: ['PyThon', 'is', 'Fun']
list: ['P', 'y', 'T', 'h', 'o', 'n', '', 'i', 's', ' ', 'F', 'u', 'n']
          find: 7
         find: 5
         find: 12
         find: 12
         find: -1
```

Strings - formatting

```
In [17]:
         s = "Hello {}, your grade is {}.".format("John", 85)
         print(s)
         s = "Hello {:10s}, your grade is {:10.2f}.".format("John", 85)
         print(s)
         s = "Hello {:>10s}, your grade is {:<10.2f}.".format("John", 85)
         print(s)
         s = "Hello {:^10s}, your grade is {:^10.2f}.".format("John", 85)
         print(s)
        Hello John, your grade is 85.
                        , your grade is
        Hello John
                                              85.00.
        Hello
                     John, your grade is 85.00
        Hello
                 John , your grade is 85.00
```

Out of range index

Lists

- like arrays in other languages
- access to elements is O(1)

```
In [19]:
           11 = []
           12 = [10, 20, 30]
           13 = ['Python', 75, 'Java', 60]
           14 = [[10, 20], [30, 40, 50]]
           print(11)
           print(12)
           print(13)
           print(14)
           print(len(11))
           print(len(12))
           print(len(13))
           print(len(14))
           []
[10, 20, 30]
['Python', 75, 'Java', 60]
[[10, 20], [30, 40, 50]]
           3
4
2
```

Lists - Indexing

```
In [20]:
            data = ['Python', 75, 'Java', 60]
            print(data[0])
            print(data[3])
            print(data[-1])
            print(data[-4])
           Python
            60
            60
           Python
Lists - Slicing
In [21]:
            data = ['Python', 75, 'Java', 60, 'R', 90]
            print(data)
            print(data[0:4])
            print(data[2:])
            print(data[:4])
            print(data[-2:])
            print(data[-4:-2])
            ['Python', 75, 'Java', 60, 'R', 90]
['Python', 75, 'Java', 60]
['Java', 60, 'R', 90]
['Python', 75, 'Java', 60]
            ['R<sup>1</sup>, 90]
            ['Java', 60]
```

Lists - Skip slicing

```
In [22]: data = ['Python', 75, 'Java', 60, 'R', 90]

print(data)
print(data[::2])
print(data[1::2])
print(data[::-1])
print(data[::-1])
print(data[::-2])

['Python', 75, 'Java', 60, 'R', 90]
['Python', 'Java', 'R']
[75, 60, 90]
['Python', 'Java']
[90, 'R', 60, 'Java', 75, 'Python']
[90, 60, 75]
```

Modifying a list

```
In [23]:
              data = ['Python', 75, 'Java', 60, 'R', 90]
              print(data)
              data[1] = 99
              print(data)
              data[1::2] = [66,77,88]
              print(data)
              data.extend(['NumPy', 55])
              print(data)
              data.append('Pandas')
              print(data)
              data.insert(-1, 'TensorFlow')
              print(data)
              data.insert(-2, 'Keras')
              print(data)
               'Python', 75, 'Java', 60, 'Python', 99, 'Java', 60,
                                                       'R', 90]
'R', 90]
                Python', 99,
                'Python', 66,
                                     'Java', 77,
                                                       'R', 88]
              ['Python', 66, 'Java', 77, 'R', 88, 'NumPy', 55]
['Python', 66, 'Java', 77, 'R', 88, 'NumPy', 55, 'Pandas']
['Python', 66, 'Java', 77, 'R', 88, 'NumPy', 55, 'TensorFlow', 'Pandas']
['Python', 66, 'Java', 77, 'R', 88, 'NumPy', 55, 'Keras', 'TensorFlow', 'Pand
              as']
```

```
In [24]: data = ['Python', 75]

data.append('Java')
print(data)

data[len(data):] = [60]
print(data)

['Python', 75, 'Java']
['Python', 75, 'Java', 60]
```

Concatenation of Lists with operators + and *

```
In [25]:
             skills = ['Python', 'Java', 'R']
             levels = [75, 85, 60]
             result = skills + levels
             print(result)
             print(levels + skills)
             print(skills + ['Numpy'])
             print(2 * skills)
             print(2 * levels)
             print(3 * levels)
             ['Python', 'Java', 'R', 75, 85, 60]
[75, 85, 60, 'Python', 'Java', 'R']
['Python', 'Java', 'R', 'Numpy']
['Python', 'Java', 'R', 'Python', 'Java', 'R']
[75, 85, 60, 75, 85, 60]
             [75, 85, 60, 75, 85, 60, 75, 85, 60]
```

Removing items from list

```
In [26]: data = ['Python', 75, 'Java', 60, 'R', 90]
    print(data)

del data[1:3]
    print(data)

['Python', 75, 'Java', 60, 'R', 90]
['Python', 60, 'R', 90]
```

```
In [27]: data = ['Python', 75, 'Java', 60, 'R', 90]
    print(data)

    data.remove('Java')
    print(data.pop())
    print(data)

    print(data.pop(2)) # remove at specified index
    print(data)

    data.clear()
    print(data)

['Python', 75, 'Java', 60, 'R', 90]
    ['Python', 75, 60, 'R', 90]
    ['Python', 75, 60, 'R']
    ['Python', 75, 60, 'R']
```

Other List methods

```
In [28]:
          data = [10, 15, 20, 15, 7, 15, 40, 15]
          print(data)
          print(data.count(15))
          print(data.index(15))
          print(data.index(15, 2))
          [10, 15, 20, 15, 7, 15, 40, 15]
          1
          3
In [29]:
          data = [10, 20, 15, 7, 40, 15]
          print(data)
          data.sort()
          print(data)
          data.reverse()
          print(data)
          data = [10, 20, 50, 100]
          data.sort(reverse = True)
          print(data)
          [10, 20, 15, 7, 40, 15]
          [7, 10, 15, 15, 20, 40]
[40, 20, 15, 15, 10, 7]
          [100, 50, 20, 10]
```

```
In [30]:
         data = [10, 20, 15, 7, 40, 15]
         print(sorted(data))
         print(data)
         print(data.sort())
         print(data)
         [7, 10, 15, 15, 20, 40]
         [10, 20, 15, 7, 40, 15]
         None
         [7, 10, 15, 15, 20, 40]
In [31]:
         data1 = [10, 20, 30]
         data2 = data1
         data2[0] = 100
         print(data1)
         print(data2)
         [100, 20, 30]
         [100, 20, 30]
In [32]:
         data1 = [10, 20, 30]
         data2 = data1.copy() # Shallow copy
         data2[0] = 100
         print(data1)
         print(data2)
         [10, 20, 30]
         [100, 20, 30]
```

```
In [33]: data1 = [10, 20, 30]
    data2 = data1[:]  # Shallow copy
    data2[0] = 100

    print(data1)
    print(data2)

[10, 20, 30]
[100, 20, 30]
```

membership in a list

```
In [34]: data = ['Python', 75, 'Java', 60, 'R', 90]
    print('Python' in data)
    print('NumPy' in data)
    print(60 in data)
    print(70 not in data)

['Python', 75, 'Java', 60, 'R', 90]
    True
    False
    True
    True
    True
    True
    True
    True
```

range

• return an immutable sequence of numbers

 $\it range(stop)$ - $\it range\ of\ numbers\ from\ 0\ to\ stop-1$

```
In [35]:
          print(range(10))
          range(0, 10)
In [36]:
          print(list(range(10)))
          [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
range(start, stop) - range of numbers from start to stop - 1
In [37]:
          print(list(range(0, 10)))
          [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
In [38]:
          print(list(range(10, 20)))
          [10, 11, 12, 13, 14, 15, 16, 17, 18, 19]
In [39]:
          print(list(range(20, 10)))
          []
range(start, stop, step)
In [40]:
          print(list(range(10, 20, 2)))
          [10, 12, 14, 16, 18]
In [41]:
          print(list(range(10, 20, -2)))
          []
```

```
In [42]:
         print(list(range(20, 10, -2)))
         [20, 18, 16, 14, 12]
In [43]:
         print(list(range(20, 10, -1)))
         [20, 19, 18, 17, 16, 15, 14, 13, 12, 11]
Iterating using range
In [44]:
         for i in range(10, 20):
             print('Square of', i, 'is', i*i)
         Square of 10 is 100
         Square of 11 is 121
         Square of 12 is 144
         Square of 13 is 169
         Square of 14 is 196
         Square of 15 is 225
         Square of 16 is 256
         Square of 17 is 289
         Square of 18 is 324
         Square of 19 is 361
In [45]:
         skills = ['Python', 'Java', 'R']
         for i in range(len(skills)):
             print('Skill#{} is {}'.format(i+1, skills[i]))
         Skill#1 is Python
         Skill#2 is Java
```

Iterating over lists

Skill#3 is R

```
In [46]:
          skills = ['Python', 'Java', 'R']
          levels = [75, 85, 60]
          for skill in skills:
              print(skill)
         Python
         Java
         R
In [47]:
         for index, skill in enumerate(skills):
              print(skill, '-->', levels[index])
         Python --> 75
         Java --> 85
         R --> 60
zip - returns an iterator of tuples
In [48]:
         print(list(zip(skills, levels)))
         [('Python', 75), ('Java', 85), ('R', 60)]
In [49]:
          for skill, level in zip(skills, levels):
              print(skill, '-->', level)
         Python --> 75
         Java --> 85
         R --> 60
```

unzip

```
In [50]:
          data = [('Python', 75), ('Java', 85), ('R', 60)]
          skills, levels = zip(*data)
          print(skills)
          print(levels)
         ('Python', 'Java', 'R') (75, 85, 60)
out of range index
In [51]:
          skills = ['Python', 'Java', 'R']
          skills[3]
                                                      Traceback (most recent call last)
         IndexError
         <ipython-input-51-85142c8d05c3> in <module>
                1 skills = ['Python', 'Java', 'R']
         ---> 2 skills[3]
         IndexError: list index out of range
```

Tuples

• a sequence of values separated by a comma

Tuple Indexing and Slicing - similar to list

```
In [53]: print(x)
    print(x[0], x[-1])

    print(y)
    print(y[1:3])
    print(y[::-1])

    (10, 20, 30)
    10 30
    ('Alice', (10, 20), [30, 40], (50, 60))
    ((10, 20), [30, 40])
    ((50, 60), [30, 40], (10, 20), 'Alice')
```

Concatenation and repetition

count and index

```
In [56]:
          z = x * 3
          print(z)
          (10, 20, 30, 10, 20, 30, 10, 20, 30)
In [57]:
          z.count(30)
Out[57]:
         3
In [58]:
          z.count(40)
         0
Out[58]:
In [59]:
          z.index(30)
Out[59]:
         2
```

```
In [60]:
          z.index(40)
         ValueError
                                                      Traceback (most recent call last)
         <ipython-input-60-0c24aa2375fa> in <module>
         ---> 1 z.index(40)
         ValueError: tuple.index(x): x not in tuple
membership test
In [61]:
          z = 100, 'Python', 80, 'R'
          print(z)
          print(80 in z)
          print('Python' in z)
          print('Java' not in z)
          (100, 'Python', 80, 'R')
         True
         True
         True
Iterating over a tuple
          x = (10, 20, 30)
In [62]:
          for value in x:
              print(value, value*value)
         10 100
         20 400
```

30 900

```
for index, value in enumerate(x):
    print(index, value)

0 10
1 20
2 30
```

other built-in functions with tuple

```
In [64]:
          x = (10, 20, 30)
          y = ('R', 'Java', 'Python')
In [65]:
          (min(x), max(x), sum(x))
          (10, 30, 60)
Out[65]:
In [66]:
          min(y), max(y)
         ('Java', 'R')
Out[66]:
In [67]:
          sorted(x, reverse = True)
         [30, 20, 10]
Out[67]:
In [68]:
          sorted(y)
         ['Java', 'Python', 'R']
Out[68]:
In [69]:
          all(x)
Out[69]:
         True
```

```
In [70]: y = (True, False, True)

print(all(y))
print(any(y))

False
True
```

Lists versus Tuples

```
In [71]:
          list_values = [10, 20, 30, 40]
          tuple values = (10, 20, 30, 40)
          print(list_values)
          print(tuple values)
          [10, 20, 30, 40]
(10, 20, 30, 40)
In [72]:
          print(len(list_values))
          print(len(tuple values))
          4
          4
In [73]:
          print(list_values.__sizeof__())
          print(tuple values. sizeof ())
         72
         56
```

```
In [74]:
         # Mutable versus Immutable
         list values[-1] = 400
         print(list_values)
         [10, 20, 30, 400]
In [75]:
         tuple values[-1] = 400
         TypeError
                                                    Traceback (most recent call last)
         <ipython-input-75-31d12efbfa96> in <module>
         ---> 1 tuple values[-1] = 400
         TypeError: 'tuple' object does not support item assignment
In [76]:
         list_values.append(50)
         print(list values)
         [10, 20, 30, 400, 50]
In [77]:
         tuple values.append(50)
         AttributeError
                                                    Traceback (most recent call last)
         <ipython-input-77-821316f2950c> in <module>
         ---> 1 tuple values.append(50)
         AttributeError: 'tuple' object has no attribute 'append'
In [78]:
         y = ('Alice', (10, 20), [30, 40], (50, 60))
         y[2][0] = 300
         print(y)
         ('Alice', (10, 20), [300, 40], (50, 60))
```

Lists and List Comprehensions

```
In [79]:
         # Using loop
         word = 'Data Science'
         letters = []
         for letter in word:
             letters.append(letter)
         print(letters)
         ['D', 'a', 't', 'a', ' ', 'S', 'c', 'i', 'e', 'n', 'c', 'e']
In [80]:
         # Using list comprehension
         word = 'Data Science'
         letters = [letter for letter in word]
         print(letters)
         ['D', 'a', 't', 'a', ' ', 'S', 'c', 'i', 'e', 'n', 'c', 'e']
```

```
In [81]:
         # Using Lambda function
         word = 'Data Science'
         letters = list(map(lambda x: x, word))
         print(letters)
         ['D', 'a', 't', 'a', ' ', 'S', 'c', 'i', 'e', 'n', 'c', 'e']
In [82]:
         # Conditions in List Comprehension
         word = 'Data Science'
         letters = [letter for letter in word if letter not in 'aeiou']
         print(letters)
         ['D', 't', ' ', 'S', 'c', 'n', 'c']
In [83]:
         data = [70, 30, 50, 80, 40, 90]
         result = [score for score in data if score > 50]
         print(result)
         [70, 80, 90]
```

Nested Lists

```
In [85]: # Using loops

result = []
for i in range(1,6):
    new_row = []
    for j in range(1,6):
        new_row.append((i,j))
    result.append(new_row)

print(result)

[[(1, 1), (1, 2), (1, 3), (1, 4), (1, 5)], [(2, 1), (2, 2), (2, 3), (2, 4), (2, 5)], [(3, 1), (3, 2), (3, 3), (3, 4), (3, 5)], [(4, 1), (4, 2), (4, 3), (4, 4), (4, 5)], [(5, 1), (5, 2), (5, 3), (5, 4), (5, 5)]]
```

```
In [86]:
            # Using list comprehension
            [(i,j) for j in range(1, 6)] for i in range(1, 6)]
            [[(1, 1), (1, 2), (1, 3), (1, 4), (1, 4)]
Out[86]:
             [(2, 1), (2, 2), (2, 3), (2, 4), (2, 5)],

[(3, 1), (3, 2), (3, 3), (3, 4), (3, 5)],

[(4, 1), (4, 2), (4, 3), (4, 4), (4, 5)],

[(5, 1), (5, 2), (5, 3), (5, 4), (5, 5)]]
In [87]:
            [(i,j) for j in range(1, i+1)] for i in range(1, 6)]
            [[(1, 1)], (2, 2)],
Out[87]:
             [(3, 1), (3, 2), (3, 3)],
             [(4, 1), (4, 2), (4, 3), (4, 4)],

[(5, 1), (5, 2), (5, 3), (5, 4), (5, 5)]]
In [88]:
            # flatten list
            data = [[1,2,3], [4], [5,6]]
            [val for row in data for val in row]
          [1, 2, 3, 4, 5, 6]
Out[88]:
In [ ]:
In [89]:
            # print 2D lists
            def print2D(x):
                  for row in x:
                       for value in row:
                            print('{:4}'.format(value), end = '')
                       print()
```

```
In [90]:
         # Nested loops - matrix transpose using loops
         data = [[1,2,3], [4,5,6]]
         print2D(data)
         result = []
         for col in range(len(data[0])):
             new row = []
             for row in data:
                 new_row.append(row[col])
             result.append(new row)
         print("Transpose is", result)
         print2D(result)
         Transpose is [[1, 4], [2, 5], [3, 6]]
                5
                6
In [91]:
         # Using list comprehension
         data = [[1,2,3], [4,5,6]]
         result = [ [row[col] for row in data] for col in range(len(data[0]))]
         print(result)
         [[1, 4], [2, 5], [3, 6]]
```

```
In [92]:
          # Using list comprehension
          def print2D(x):
              print('\n'.join([''.join(['{:4}'.format(item) for item in row])
                for row in x]))
          print2D(data)
          print("Transpose is")
          print2D(result)
                     3
6
         Transpose is
                 5
                 6
             3
In [93]:
         print2D([[i*j for j in range(1, 11)] for i in range(1, 11)])
                                                  10
                                  6
                                              18
                         8
                             10
                                 12
                                     14
                                          16
                                                  20
                    9
12
                 6
                         12
                             15
                                 18
                                     21
                                          24
                                              27
                                                  30
                 8
                             20
                        16
                                 24
                                     28
                                          32
                                              36
                                                  40
                10
                    15
                        20
                             25
                                 30
                                     35
                                          40
                                              45
                                                  50
                12
                    18
                        24
                             30
                                 36
                                     42
                                              54
                                          48
                                                  60
                14
                    21
                        28
                             35
                                 42
                                     49
                                              63
                                          56
                                                  70
             8
                16
                    24
                        32
                                     56
                                              72
                             40
                                 48
                                          64
                                                  80
                18
                    27
                             45
                                 54
                                     63
                                              81
                                                  90
                         36
                                          72
            10
               20
                                     70
                                             90 100
                    30
                        40
                             50
                                 60
                                          80
```

Dictionary

- unordered collection of key-value pairs
- indexed by keys
 - can be any immutable type strings, numbers, tuples with only strings and numbers
- empty dictionary {}

```
In [94]: d1 = {}
    d2 = {1: 'Python', 2: 'Java'}
    d3 = {'Java': ['CS520', 'CS526'], 'Python': ['CS521', 'CS677', 'CS767'] }

print(d1)
print(d2)
print(d3)

{}
{1: 'Python', 2: 'Java'}
{'Java': ['CS520', 'CS526'], 'Python': ['CS521', 'CS677', 'CS767']}
```

The dict() constructor builds dictionaries directly from sequences of key-value pairs

```
In [96]:
           print(d2[1])
           print(d3['Python'])
           print(d3[d2[1]])
          Pvthon
           ['CS521', 'CS677', 'CS767']
['CS521', 'CS677', 'CS767']
In [97]:
           d3['R']
                                                             Traceback (most recent call last)
          <ipython-input-97-1860c03d820e> in <module>
          ---> 1 d3[ R']
          KeyError: 'R'
In [98]:
           print(d2.get(1))
           print(d3.get('Python'))
           print(d3.get(d2.get(1)))
          Python
           ['CS521', 'CS677', 'CS767']
['CS521', 'CS677', 'CS767']
In [99]:
           print(d3.get('R'))
          None
```

Alternative ways of creating dictionaries

```
In [100]:    a = dict(one=1, two=2, three=3)
    b = {'one': 1, 'two': 2, 'three': 3}
    c = dict(zip(['one', 'two', 'three'], [1, 2, 3]))
    d = dict([('two', 2), ('one', 1), ('three', 3)])
    e = dict({'three': 3, 'one': 1, 'two': 2})

    print(a)

    print(a == b == c == d == e)

{'one': 1, 'two': 2, 'three': 3}
True
```

Modifying and adding items in a dictionary

```
In [101]: d2 = dict({1: 'Python', 2: 'Java'})
    print(d2)

d2[2] = 'C++'
    d2[5] = 'R'
    d2['a'] = 'Go'

print(d2)

{1: 'Python', 2: 'Java'}
{1: 'Python', 2: 'C++', 5: 'R', 'a': 'Go'}
```

deleting items from a dictionary

membership in a dictionary

Other dictionary methods

keys

```
In [104]:
          print(d3)
          print(d3.keys())
          {'Java': ['CS520', 'CS526'], 'Python': ['CS521', 'CS677', 'CS767']} dict_keys(['Java', 'Python'])
In [105]:
          for item in d3:
               print(item)
          Java
          Python
In [106]:
          for item in d3.keys():
               print(item)
          Java
          Python
In [107]:
          for index, item in enumerate(d3):
               print(index, item)
          0 Java
          1 Python
values
In [108]:
          print(d3.values())
          dict values([['CS520', 'CS526'], ['CS521', 'CS677', 'CS767']])
In [109]:
          for item in d3.values():
               print(item)
          ['CS520', 'CS526']
['CS521', 'CS677', 'CS767']
```

items

Dictionary comprehension

```
In [112]:    powers = {i: 2**i for i in range(10)}
        print(powers)
        print(powers[8])

{0: 1, 1: 2, 2: 4, 3: 8, 4: 16, 5: 32, 6: 64, 7: 128, 8: 256, 9: 512}

In [113]:  # Without comprehension

    powers = {}
    for i in range(10):
        powers[i] = 2**i

        print(powers)

{0: 1, 1: 2, 2: 4, 3: 8, 4: 16, 5: 32, 6: 64, 7: 128, 8: 256, 9: 512}
```

Sets

- unordered collection of items
- every item is unique
- every item is immutable

```
In [115]: s1 = set() # {} is an empty dictionary
    s2 = {10, 20, 10, 30}
    s3 = set([10, 20, 30, 10, 20])
    print(s1)
    print(s2)
    print(s3)

set()
    {10, 20, 30}
    {10, 20, 30}
```

no mutable items in a set

no indexing support

Adding elements to a set

```
In [118]: s2 = {10, 20, 10, 30}
    print(s2)

    s2.add(40)
    print(s2)

    s2.add((40, 45))
    print(s2)

{10, 20, 30}
    {40, 10, 20, 30}
    {40, 45), 40, 10, 20, 30}
```

Removing items from a set

```
In [121]: s2 = {10, 20, 10, 30}
    print(s2)

s2.remove(10)
    print(s2)

{10, 20, 30}
{20, 30}
```

Membership in a set

```
In [122]: s2 = {10, 20, 10, 30}
    print(s2)

    print(10 in s2)
    print(40 in s2)
    print(50 not in s2)

    {10, 20, 30}
    True
    False
    True
```

Set Union

```
In [123]:    a = {10, 20, 30, 40}
    b = {30, 40, 50}

# Union

print(a | b)

print(a.union(b))

print(b.union(a))

{50, 20, 40, 10, 30}
{50, 20, 40, 10, 30}
{50, 20, 40, 10, 30}
```

Set Intersection

```
In [124]: a = {10, 20, 30, 40}
b = {30, 40, 50}

# Intersection

print(a & b)

print(a.intersection(b))

print(b.intersection(a))

{40, 30}
{40, 30}
{40, 30}
{40, 30}
```

Set Difference

```
In [125]:    a = {10, 20, 30, 40}
    b = {30, 40, 50}

# Difference

print(a - b)
print(a.difference(b))

print(b - a)
print(b.difference(a))

{10, 20}
{10, 20}
{50}
{50}
```

Symmetric difference (except those that are common in both)

```
In [126]: a = {10, 20, 30, 40}
b = {30, 40, 50}

# Symmetric Difference

print(a ^ b)
print(a.symmetric_difference(b))

{10, 50, 20}
{10, 50, 20}
```

Set Comparison

```
In [127]: a = {10, 20, 30, 40}
b = {30, 40, 50}
print(a.isdisjoint(b))
```

False

```
In [128]: a = {10, 20, 30, 40}
b = {50, 60}
print(a.isdisjoint(b))
```

True

```
In [129]: a = \{10, 20\}
          b = \{10, 15, 20, 25\}
          print(a.issubset(b))
          True
Iterating over sets
In [130]: a = \{10, 20, 30, 40\}
          b = \{30, 40, 50\}
          c = a \mid b
          print(c)
          for item in c:
              print (item)
          {50, 20, 40, 10, 30}
          50
          20
          40
          10
          30
In [131]: | for item in enumerate(c):
```

Functions ... continued

(0, 50) (1, 20) (2, 40) (3, 10) (4, 30)

print (item)

Functions with default arguments

```
In [132]:
         def greet(name, className = 'CS677'):
             return ("Hello " + name + ", Welcome to " + className)
In [133]:
         print(greet('John'))
         Hello John, Welcome to CS677
In [134]: | print(greet('John', 'CS777'))
         Hello John, Welcome to CS777
In [135]:
         def greet(name, className = 'CS677', instructor):
             return ("Hello " + name + ", Welcome to " + className)
           File "<ipython-input-135-ef53871c95a3>", line 1
             def greet(name, className = 'CS677', instructor):
         SyntaxError: non-default argument follows default argument
In [136]: | def greet(name, className = 'CS677', instructor = 'Suresh'):
             return ("Hello " + name + ", Welcome to " + className + " - " + instructo
         r)
In [137]: | print(greet('John'))
         Hello John, Welcome to CS677 - Suresh
In [138]: | print(greet('John', 'CS546'))
         Hello John, Welcome to CS546 - Suresh
```

Functions with variable arguments

Functions with keyword arguments

```
In [143]:
         def my average(name, **kwargs):
             print(name, kwargs)
             result = 0
              if (len(kwargs) == 0):
                  return result
              for key, value in kwargs.items():
                  print('Score in {} = {}'.format(key, value))
                  result += value
             return (result / len(kwargs))
In [144]: | my average('John', cs1=70, cs2=80, cs3=90)
         John {'cs1': 70, 'cs2': 80, 'cs3': 90}
         Score in cs1 = 70
         Score in cs2 = 80
         Score in cs3 = 90
Out[144]: 80.0
In [145]: | my_average('abc')
         abc {}
Out[145]: 0
Anonymous (Lambda) Functions
In [146]: double = lambda x: 2 * x
```

```
In [147]:
         print(double(5))
         10
In [148]:
         print(double([10,20]))
         [10, 20, 10, 20]
In [149]:
         # generally used as argument for higher order functions
         data = [10, 13, 15, 18, 20, 23, 26]
         list(filter(lambda x: (x %2 == 1), data))
Out[149]: [13, 15, 23]
In [150]:
         list(map(double, data))
Out[150]: [20, 26, 30, 36, 40, 46, 52]
In [151]: list(map(lambda x: x * x, data))
Out[151]: [100, 169, 225, 324, 400, 529, 676]
```

Indirect references

```
In [152]: a = (10, 20, [30, 40], 50)
          print(a)
          b = a[2]
          b[0] = 300
          print(b)
          print(a)
         (10, 20, [30, 40], 50)
[300, 40]
          (10, 20, [300, 40], 50)
In [153]:
         # Caution - list references
          lists = [[]] * 3
          lists[0].append(3)
          lists[1].append(5)
          lists[2].append(7)
          print(lists)
         [[3, 5, 7], [3, 5, 7], [3, 5, 7]]
```

```
In [154]: # correct approach
    lists = [[] for i in range(3)]
    lists[0].append(3)
    lists[1].append(5)
    lists[2].append(7)
    print(lists)
    [[3], [5], [7]]
In []:
```