Structures de données avancées en python

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OBJECT ORIENTED PROGRAMMING

- Algorithm Analysis
- II. Python Primer (hands on parctice lab)
- III. Object-Oriented Programming
- w. Maps, Hash Tables

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Object-Oriented Design Goals

- Robustness: a program produces the right output for all the anticipated inputs in the program's application.
- Adaptability: Able to evolve over time in response to changing conditions in its environment (also called evolvability),
 - portability, ability of software to run with minima change on different hardware and operating system platforms.
- Reusability: the same code should be usable as a component of different systems in various applications.

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Object-Oriented Design Principles

- **Modularity:** several different components: the that must interact correctly in order for the entire system to work properly.
 - a module is a collection of closely related functions and classes that are defined together in a single file of source code.
- Abstraction: notion of abstraction is to distill a complicated system down to its most fundamental parts.
 - Abstract data types (ADTs).
 - A mathematical model of a data structure that specifies the type of data stored, the operations supported on them, and the types of parameters of the operations.
 - An ADT specifies what each operation does, but not how it does it.

Software Development

- Three major steps are:
 - . Design
 - 2. Implementation
 - Testing and Debugging

Object-Oriented Design Principles

• **Encapsulation:** Different components of a software system should not reveal the internal details of their respective implementations.



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Class Definitions

- Attributes (also known as fields, instance variables, or data members
- Member functions (also known as methods)

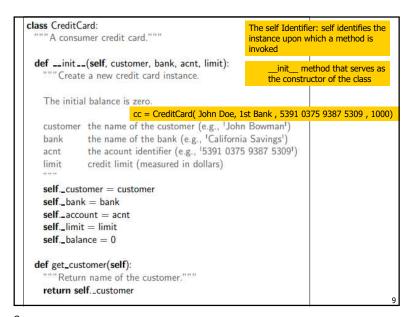
Class:	CreditCard		
Fields:	_customer _bank _account	_balance _limit	
Behaviors:	get_customer() get_bank() get_account() make_payment(amount)	get_balance() get_limit() charge(price)	

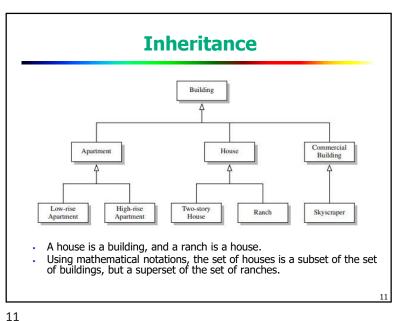
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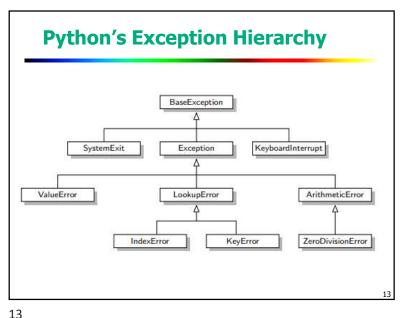
def get_bank(self): ""Return the bank's name.""" return self._bank def get_account(self): ""Return the card identifying number (typically stored as a string).""" return self._account def get_limit(self): ""Return current credit limit.""" return self._limit def get_balance(self): ""Return current balance." return self._balance def charge(self, price): ""Charge given price to the card, assuming sufficient credit limit. Return True if charge was processed; False if charge was denied. if price + self._balance > self._limit: # if charge would exceed limit, return False # cannot accept charge self._balance += price return True def make_payment(self, amount): """Process customer payment that reduces balance.""" self._balance -= amount

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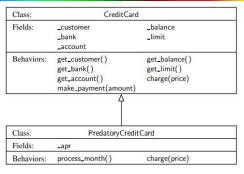
Inheritance

- Organize various structural components of a software package in a hierarchical fashion.
- The correspondence between levels is often referred to as an "is a" relationship
- Base class, parent class, or superclass, while the newly defined class is known as the subclass or child class
- A subclass may specialize an existing behavior by providing a new implementation that overrides an existing method
- A subclass may also extend its superclass by providing brand new methods



```
class PredatoryCreditCard(CreditCard):
 """An extension to CreditCard that compounds interest and fees."""
 def __init__(self, customer, bank, acnt, limit, apr):
    """Create a new predatory credit card instance.
    The initial balance is zero.
    customer the name of the customer (e.g., 'John Bowman')
              the name of the bank (e.g., 'California Savings')
    bank
              the acount identifier (e.g., '5391 0375 9387 5309')
    acnt
    limit
              credit limit (measured in dollars)
              annual percentage rate (e.g., 0.0825 for 8.25% APR)
    apr
    super().__init__(customer, bank, acnt, limit)
                                                     # call super constructor
    self._apr = apr
```

Extending the CreditCard Class



- If an attempted charge is rejected because it would have exceeded the credit limit, a \$5 fee will be charged.
- there will be a mechanism for assessing a monthly interest charge on the outstanding balance, based upon an Annual Percentage Rate (APR) specified as a constructor parameter

```
def charge(self, price):
  """ Charge given price to the card, assuming sufficient credit limit.
  Return True if charge was processed.
  Return False and assess $5 fee if charge is denied.
 success = super().charge(price)
                                             # call inherited method
 if not success:
    self._balance += 5
                                             # assess penalty
  return success
                                             # caller expects return value
def process_month(self):
  """ Assess monthly interest on outstanding balance."""
    # if positive balance, convert APR to monthly multiplicative factor
    monthly_factor = pow(1 + self.\_apr, 1/12)
    self._balance *= monthly_factor
```

Abstract Base Classes

- An abstract base class is one that cannot be directly instantiated, while a concrete class is one that can be instantiated
- In classic object-oriented terminology, we say a class is an abstract base class if its only purpose is to serve as a base class through inheritance

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```
1 from abc import ABCMeta, abstractmethod
                                                      # need these definitions
3 class Sequence(metaclass=ABCMeta):
    """Our own version of collections. Sequence abstract base class.""
    @abstractmethod
    def __len __(self):
      """ Return the length of the sequence."""
    @abstractmethod
    def __getitem __(self, j):
      """Return the element at index i of the sequence."""
    def __contains__(self, val):
       """ Return True if val found in the sequence; False otherwise."""
      for j in range(len(self)):
        if self[i] == val:
                                                       # found match
          return True
      return False
```

Abstract Classes

- Considered as a blueprint or template for other classes.
- Contains one or more abstract methods.
- An abstract method is a method that has declaration but no implementation.
- Abstract classes can not be instantiated. It needs subclasses (child classes) to provide implementation.
- Abstract classes are required for providing "Abstraction" or a simplified interface (API) while hiding the underlying implementation.
- Python provides abstract classes by declaring abstract base class (ABC) which could be inherited by other child classes.

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```
20
21
      def index(self, val):
       """ Return leftmost index at which val is found (or raise ValueError)."""
22
23
       for j in range(len(self)):
         if self[j] == val:
24
                                                       # leftmost match
25
26
        raise ValueError('value not in sequence') # never found a match
27
28
      def count(self, val):
       """ Return the number of elements equal to given value."""
29
30
       k = 0
31
       for i in range(len(self)):
32
         if self[j] == val:
                                                       # found a match
33
          k += 1
        return k
```

Nested Classes

 Nest one class definition within the scope of another class

class A: # the outer class class

B: # the nested class

- Class B is the nested class.
- The identifier B is entered into the namespace of class A associated with the newly defined class.
- This technique is unrelated to the concept of inheritance, as class B does not inherit from class A ...

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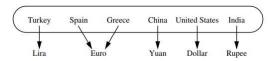
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The Map ADT

- M[k]: Return the value v associated with key k in map M, if one exists; otherwise raise a KeyError. (python: getitem).
- M[k] = v: Associate value v with key k in map M, replacing the existing value if the map already contains an item with key equal to k. (Python: setitem)
- del M[k]: Remove from map M the item with key equal to k; if M has no such item, then raise a KeyError. (Python: __delitem___).
- len(M): Return the number of items in map M. (Python:
 len___)
- iter(M): The default iteration for a map generates a sequence of keys in the map.(Python: iter)

Maps and Dictionaries

- Python's dict class is arguably the most significant data structure in the language.
- It represents an abstraction known as a dictionary in which unique keys are mapped to associated values
- Dictionaries: arrays or maps



A map from countries (the keys) to their units of currency (the values).

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The Map ADT

- k in M: Return True if the map contains an item with key k. (Python: special contains method.)
- M.get(k, d=None): Return M[k] if key k exists in the map; otherwise return default value d. This provides a form to query M[k] without risk of a KeyError.
- M.setdefault(k, d): If key k exists in the map, simply return M[k]; if key k does not exist, set M[k] = d and return that value.
- M.pop(k, d=None): Remove the item associated with key k from the map and return its associated value v. If key k is not in the map, return default value d (or raise KeyError if parameter d is None)

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The Map ADT

- M.popitem(): Remove an arbitrary key-value pair from the map, and return a (k,v) tuple representing the removed pair. If map is empty, raise a KeyError.
- M.clear(): Remove all key-value pairs from the map.
- M.keys(): Return a set-like view of all keys of M.
- M.values(): Return a set-like view of all values of M.
- M.items(): Return a set-like view of (k,v) tuples for all entries of M.
- M.update(M2): Assign M[k] = v for every (k,v) pair in map M2.
- M == M2: Return True if maps M and M2 have identical key-value associations.
- M!= M2: Return True if maps M and M2 do not have identical keyvalue associations.

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Application: Counting Word Frequencies

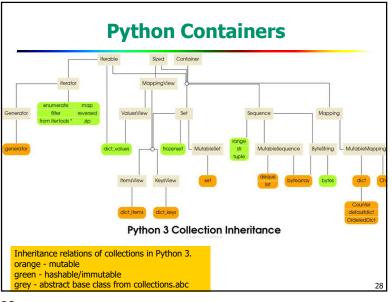
```
freq = { }
for piece in open(filename).read().lower().split():
    # only consider alphabetic characters within this piece
    word = ''.join(c for c in piece if c.isalpha())
    if word: # require at least one alphabetic character
        freq[word] = 1 + freq.get(word, 0)

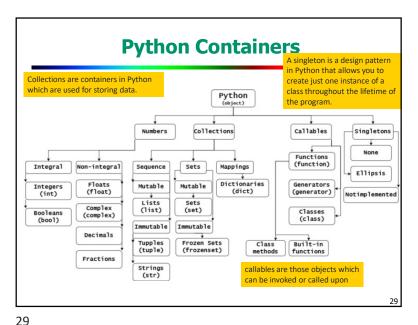
max_word = ''
max_count = 0
for (w,c) in freq.items(): # (key, value) tuples represent (word, count)
if c > max_count:
    max_word = w
    max_count = c
print('The most frequent word is', max_word)
print('Its number of occurrences is', max_count)
```

The Map ADT

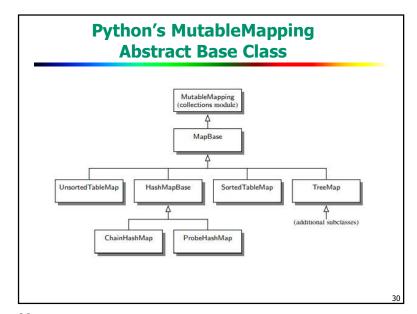
Operation	Return Value	Map
len(M)	0	{}
M['K'] = 2		{'K': 2}
M['B'] = 4		{'K': 2, 'B': 4}
M['U'] = 2	-	{'K': 2, 'B': 4, 'U': 2}
M['V'] = 8	-	{ 'K': 2, 'B': 4, 'U': 2, 'V': 8}
M['K'] = 9	=	{'K': 9, 'B': 4, 'U': 2, 'V': 8}
M['B']	4	{'K': 9, 'B': 4, 'U': 2, 'V': 8}
M['X']	KeyError	{'K': 9, 'B': 4, 'U': 2, 'V': 8}
M.get('F')	None	{ 'K': 9, 'B': 4, 'U': 2, 'V': 8}
M.get('F', 5)	5	{'K': 9, 'B': 4, 'U': 2, 'V': 8}
M.get('K', 5)	9	{'K': 9, 'B': 4, 'U': 2, 'V': 8}
len(M)	4	{'K': 9, 'B': 4, 'U': 2, 'V': 8}
del M['V']	_	{'K': 9, 'B': 4, 'U': 2}
M.pop('K')	9	{ 'B': 4, 'U': 2}
M.keys()	'B', 'U'	{ 'B': 4, 'U': 2}
M.values()	4, 2	{'B': 4, 'U': 2}
M.items()	('B', 4), ('U', 2)	{ 'B': 4, 'U': 2}
M.setdefault('B', 1)	4	{ 'B': 4, 'U': 2}
M.setdefault('A', 1)	1	{'A': 1, 'B': 4, 'U': 2}
M.popitem()	('B', 4)	{'A': 1, 'U': 2}

We use the literal syntax for Python's dict class to describe the map contents.





```
MapBase
    class MapBase(MutableMapping):
      """Our own abstract base class that includes a nonpublic Litem class."""
                             - nested Jtem class -
      class _ltem:
       """Lightweight composite to store key-value pairs as map items."""
        __slots__ = '_key', '_value'
       def __init__(self, k, v):
10
         self.\_key = k
11
         self._value = v
12
13
       def __eq__(self, other):
14
         return self._key == other._key
                                           # compare items based on their keys
15
16
       def __ne__(self, other):
17
         return not (self == other)
                                           # opposite of _eq_
18
19
       def __lt__(self, other):
20
         return self._key < other._key
                                          # compare items based on their keys
```



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```
HashMapBase
   class HashMapBase(MapBase):
        "Abstract base class for map using hash-table with MAD compression."""
4
      def __init__(self, cap=11, p=109345121):
       """ Create an empty hash-table map.""
6
       self._table = cap * [ None ]
       self._n = 0
                                               # number of entries in the map
       self.\_prime = p
                                               # prime for MAD compression
9
       self.\_scale = 1 + randrange(p-1)
                                               # scale from 1 to p-1 for MAD
10
       self.\_shift = randrange(p)
                                               # shift from 0 to p-1 for MAD
11
12
      def _hash_function(self, k):
13
       return (hash(k)*self._scale + self._shift) % self._prime % len(self._table)
14
```

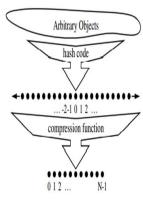
HashMapBase

```
def __len__(self):
16
        return self._n
17
18
      def __getitem __(self, k):
19
       i = self._hash_function(k)
20
        return self._bucket_getitem(j, k)
                                                 # may raise KeyError
21
22
      def __setitem__(self, k, v):
23
       j = self._hash_function(k)
24
        self._bucket_setitem(j, k, v)
                                                 # subroutine maintains self._n
25
        if self._n > len(self._table) // 2:
                                                 # keep load factor <= 0.5
26
          self._resize(2 * len(self._table) - 1)
                                               # number 2^x - 1 is often prime
27
```

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Hash Functions

- Hash function, h, maps each key k to an integer in the range [0,N - 1], where N is the capacity of the bucket array for a hash table.
- "A hash function, h(k), as consisting of two portions:
 - A hash code that maps a key k to an integer,
 - and a compression function that maps the hash code to an integer within a range of indices, [0,N -1], for a bucket array



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HashMapBase

```
def __delitem__(self, k):
        j = self._hash_function(k)
30
        self._bucket_delitem(j, k)
                                                 # may raise KeyError
31
        self_{-n} = 1
32
33
      def _resize(self, c):
                                         # resize bucket array to capacity c
34
        old = list(self.items())
                                         # use iteration to record existing items
35
        self.\_table = c * [None]
                                         # then reset table to desired capacity
36
        self._n = 0
                                         # n recomputed during subsequent adds
37
        for (k,v) in old:
38
          self[k] = v
                                         # reinsert old kev-value pair
```

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Hash Codes

■ Treating the Bit Representation as an Integer:

Integer 32 bits. (-) 64 bits?

2. Any object x whose binary representation can be viewed as an n-tuple (x0,x1,...,xn-1) of 32-bit integers:

 $\sum_{i=0}^{n-1}x_i$ as x0 \oplus x1 \oplus ··· \oplus xn-1, where the \oplus symbol represents the bitwise exclusive-or operation (^ in Python)

(-)collisions for common groups of strings :"temp01" and "temp10" collide using this function ("stop", "tops", "pots", and "spot").

Polynomial Hash Codes: take into consideration the positions of the xi's. choose a nonzero constant, $a \neq 1$

$$x_0a^{n-1} + x_0a^{n-2} + \dots + x_{n-2}a + x_{n-1}$$

By Horner's rule : $x_{n-1} + a(x_{n-2} + a(x_{n-2} + a(x_{n-3} + \dots + a(x_2 + a(x_{n-1} + ax_0))\dots))$

.

Hash Codes

4. Cyclic-Shift Hash Codes:

A variant of the polynomial hash code replaces multiplication by a with a cyclic shift of a partial sum by a certain number of bits.

5-bit cyclic shift of the 32-bit value taking the leftmost five bits 001111011001011010101010101000 placing them on the rightmost side of the representation 10110010110101010101010101010101011.

(Python, cyclic shift of bits by careful use of the bitwise operators << and >>, taking care to truncate results to 32-bit integers.)

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Hash Codes in Python

- A built-in function with signature hash(x) that returns an integer value that serves as the hash code for object x.
- Only immutable data types are deemed hashable in Python.
 - Among Python's built-in data types, the immutable int, float, str, tuple, and frozenset classes produce robust hash codes, via the hash function, using techniques similar to those discussed earlier in this section.
 - Hash codes for character strings are well crafted based on a technique similar to polynomial hash codes, except using exclusive-or computations rather than additions.

Hash Codes

```
\begin{array}{ll} \text{def hash\_code(s):} \\ \text{mask} = (1 << 32) - 1 \\ \text{h} = 0 \\ \text{for character in s:} \\ \text{h} = (\text{h} << 5 \& \text{mask}) \mid (\text{h} >> 27) \\ \text{h} += \text{ord(character)} \\ \text{return h} \end{array} \begin{array}{ll} \# \text{ limit to } 32\text{-bit integers} \\ \# \text{ 5-bit cyclic shift of running sum} \\ \# \text{ add in value of next character} \\ \text{return h} \end{array}
```

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Hash Codes in Python

- Hash codes for tuples:
 - Combination of the hash codes of the individual elements of the tuple.
 - Exclusive-or of the individual hash codes without any shifting.
- If hash(x) is called for an instance x of a mutable type, such as a list, a TypeError is raised
- Instances of user-defined classes are treated as unhashable by default, with a TypeError raised by the hash function.
- A function that computes hash codes can be implemented in the form of a special method named hash within a class.

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Hash function for color class

• Color class: red, green, and blue

def __hash__ (self):
 return hash((self. red, self. green, self. blue))
 # hash combined tuple

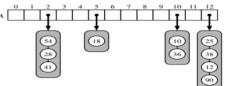
- Any implementation of hash must be consistent:
 - if x == y, then hash(x) == hash(y).
 - This rule extends to any well-defined comparisons between objects of different classes.
 - For example, Since Python treats the expression 5 == 5.0 as true, it ensures that hash(5) and hash(5.0) are the same.

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Collision-Handling Schemes

- Separate Chainings:
 - Assuming we use a good hash function to index the n items of our map in a bucket array of capacity N,
 - the expected size of a bucket is n/N.
 - The core map operations run in O(n/N).
 - The ratio $\lambda = n/N$, called the load factor of the hash table, should be bounded by a small constant, preferably below 1.
 - As long as λ is O(1), the core operations on the hash table run in O(1) expected time



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Compression Functions

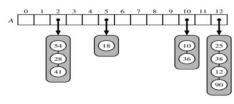
- The Division Method:
 - k mod N, where N, the size of the bucket array, is a fixed positive integer.
- Multiply-Add-and-Divide (or "MAD") method.
 - [(ai+b) mod p] mod N
 where N is the size of the bucket array,
 p is a prime number larger than N,
 and a and b are integers chosen at random from the interval [0, p-1], with a > 0.

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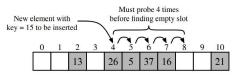
Collision-Handling Schemes

- slight disadvantage:
 - Use of an auxiliary data structure—a list—to hold items with colliding keys. (-) a program for a small handheld device
- Open addressing :
 - requires that the load factor is always at most 1
 - items are stored directly in the cells of the bucket array itself.



Linear Probing and Its Variants

- if we try to insert an item (k,v) into a bucket A[j] that is already occupied, where j = h(k),
 - then we next try A[(j +1) mod N].
 - If A[(j +1) mod N] is also occupied,
 - then we try A[(j + 2) mod N],
 - and so on, until we find an empty bucket that can accept the new item



Insertion into a hash table with integer keys using linear probing. The hash function is $h(k) = k \mod 11$. Values associated with keys are not shown.

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Linear Probing and Its Variants

- Double hashing strategy:
 - choose a secondary hash function, h'
 - if h maps some key k to a bucket A[h(k)] that is already occupied,
 - Then iteratively try the buckets $A[(h(k) + f(i)) \mod N]$ next, for i = 1,2,3,..., where $f(i) = i \cdot h'(k)$.
 - the secondary hash function is not allowed to evaluate to zero; a common choice is:
 - $H'(k) = q-(k \mod q)$, for some prime number q < N.
 - N should be a prime.
- Python's dictionary class:
 - Avoid clustering with open addressing
 - Iteratively try buckets A[(h(k) + f(i)) mod N]
 - f(i) is based on a pseudo-random number generator, sequence of subsequent probes that depends upon bits of the original hash code.

Linear Probing and Its Variants

- Quadratic probing :
 - Iteratively tries the buckets A[(h(k)+ f(i)) mod N], for i = 0,1,2,..., where f(i) = i², until finding an empty bucket.
 - creates secondary clustering, where the set of filled array cells still has a non-uniform pattern
 - When N is prime and the bucket array is less than half full, the quadratic probing strategy is guaranteed to find an empty slot.
 - However, this guarantee is not valid once the table becomes at least half full, or if N is not chosen as a prime number;

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Open adressing implementation

```
class ProbeHashMap(HashMapBase):

""" Hash map implemented with linear probing for collision resolution."""

AVAIL = object()  # sentinal marks locations of previous deletions

def _is_available(self, j):

"""Return True if index j is available in table."""

return self._table[j] is None or self._table[j] is ProbeHashMap._AVAIL
```

Open adressing implementation

```
def _find_slot(self, j, k):
        """Search for key k in bucket at index j.
11
12
        Return (success, index) tuple, described as follows:
13
        If match was found, success is True and index denotes its location.
14
        If no match found, success is False and index denotes first available slot,
15
16
        firstAvail = None
17
        while True:
          if self._is_available(i):
18
19
            if firstAvail is None:
20
               firstAvail = i
                                                         # mark this as first avail
            if self._table[i] is None:
21
22
               return (False, firstAvail)
                                                         # search has failed
23
          elif k == self._table[j]._key:
24
            return (True, j)
                                                         # found a match
25
          j = (j + 1) \% len(self.\_table)
                                                         # keep looking (cyclically)
```

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Open adressing implementation

```
def _bucket_delitem(self, j, k):
41
        found, s = self.\_find\_slot(j, k)
42
        if not found:
43
          raise KeyError('Key Error: ' + repr(k))
                                                              # no match found
44
        self._table[s] = ProbeHashMap._AVAIL
                                                              # mark as vacated
45
46
      def __iter__(self):
47
        for j in range(len(self._table)):
                                                              # scan entire table
48
          if not self._is_available(j):
49
            yield self._table[i]._key
```

Open adressing implementation

```
def _bucket_getitem(self, j, k):
27
        found, s = self._find_slot(i, k)
28
        if not found:
29
          raise KeyError('Key Error: ' + repr(k))
                                                              # no match found
30
        return self._table[s]._value
31
      def _bucket_setitem(self, i, k, v):
33
        found, s = self.\_find\_slot(i, k)
34
        if not found:
          self.\_table[s] = self.\_ltem(k,v)
35
                                                              # insert new item
36
          self._n += 1
                                                              # size has increased
37
38
          self._table[s]._value = v
                                                              # overwrite existing
39
```

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Separate Chainings implementation

```
1 class ChainHashMap(HashMapBase):
     """ Hash map implemented with separate chaining for collision resolution."""
 4
      def _bucket_getitem(self, j, k):
        bucket = self._table[j]
        if bucket is None:
          raise KeyError('Key Error: ' + repr(k))
                                                           # no match found
        return bucket[k]
                                                           # may raise KeyError
 9
      def _bucket_setitem(self, j, k, v):
10
11
        if self._table[j] is None:
          self._table[j] = UnsortedTableMap( )
12
                                                    # bucket is new to the table
        oldsize = len(self._table[i])
13
        self.\_table[j][k] = v
14
15
        if len(self._table[j]) > oldsize:
                                                    # key was new to the table
          self._n += 1
16
                                                    # increase overall map size
17
```

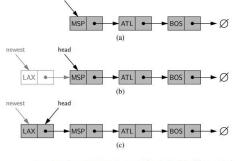
Separate Chainings implementation

```
def _bucket_delitem(self, j, k):
18
19
        bucket = self._table[i]
20
        if bucket is None:
21
          raise KeyError('Key Error: ' + repr(k))
                                                          # no match found
22
        del bucket[k]
                                                          # may raise KeyError
23
24
      def __iter__(self):
25
        for bucket in self._table:
26
          if bucket is not None:
                                                          # a nonempty slot
27
            for key in bucket:
28
              yield key
```

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Separate Chainings implementation

Implement separate chainings par single linked list



Insertion of an element at the head of a singly linked list: (a) before the insertion; (b) after creation of a new node; (c) after reassignment of the head reference.

Separate Chainings implementation Implement separate chainings par single linked list class .Node: """Lightweight, nonpublic class for storing a singly linked node.""" ...slots... = '_element', '_next' # streamline memory usage def __init__(self, element, next): # initialize node's fields self._element = element # reference to user's element self._next = next # reference to next node LAX MSP ATL BOS tail Example of a singly linked list whose elements are strings indicating

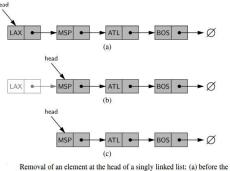
airport codes. The list instance maintains a member named head that identifies the first node of the list, and in some applications another member named tail that

identifies the last node of the list. The None object is denoted as Ø.

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Separate Chainings implementation

Implement separate chainings with single linked list



removal; (b) after "linking out" the old head; (c) final configuration.

Separate Chainings implementation

•Implement separate chainings with single linked list

```
---- nested _Node class ---
class _Node:
  """Lightweight, nonpublic class for storing a singly linked node."""
  __slots__ = '_element', '_next'  # streamline memory usage
  def __init__(self, element, next): # initialize node's fields
    self._element = element
                                       # reference to user's element
    self_next = next
                                        # reference to next node
def __init __(self):
 self._head = None
                                     # reference to the head node
 self.\_size = 0
                                        # number of
                                                         elements
def __len __(self):
 """Return the number of elements
 return self._size
```

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Exercises

- Give a concrete implementation of the pop method in the context of the MutableMapping class, relying only on the five primary abstract methods of that class.
- 2. Give a concrete implementation of the items() method in the context of the MutableMapping class, relying only on the five primary abstract methods of that class.
- 3. Which of the hash table collision-handling schemes could tolerate a load factor above 1 and which could not?

Separate Chainings implementation

Implement separate chainings with single linked list

```
def push(self, e):

"""Add element e
self._head — self._Node(e, self._head)

self._size += 1

def _delete_node(self, e, predecessor ):
    predecessor._next = node._next
    self._size = 1 !
    element = node_element
    node._element = None  # deprecate node
    return element #
```

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Exercises

- What would be a good hash code for a vehicle identification number that is a string of numbers and letters of the form "9X9XX99XX999999," where a "9" represents a digit and an "X" represents a letter?
- 4. Computing a hash code can be expensive, especially for lengthy keys. In our hash table implementations, we compute the hash code when first inserting an item, and recompute each item's hash code each time we resize our table. Python's dict class makes an interesting tradeoff. The hash code is computed once, when an item is inserted, and the hash code is stored as an extra field of the item composite, so that it need not be recomputed. Reimplement our HashTableBase class to use such an approach

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Problem

Key word extraction in text documents: implement Text Rank and its variants

- Prepare data
- Word frequency in documents (dict)
- Construct Graph of word co-occurrency (sparce matrix)
- Apply Page Rank to retrive key word