



Department of Computer Science and Engineering

Data Structures and Object-Oriented Design

(CSE – 2050)

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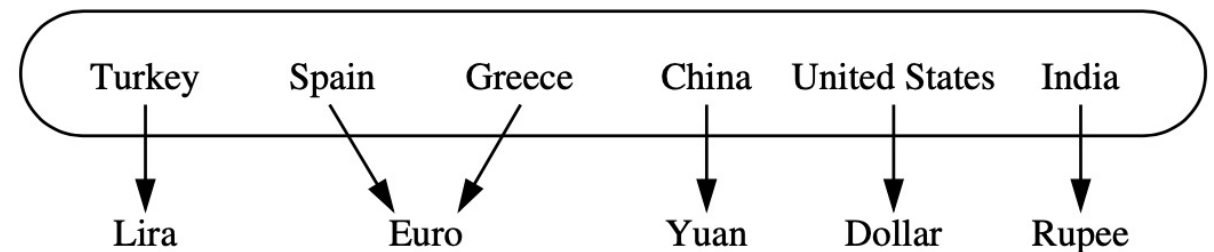
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Module 8

Mapping and Hashing

Mapping

- A mapping can be defined as an association between two objects.
 - Example: map between Stamford and New York
- These associated objects are also referred as “key-value” pair
- The array of such key-value pairs are sometimes referred as “associative arrays” or “maps”
- Python has a built-in data type available to hold key-value pairs → Dictionary
- Key must always be unique



Mapping

- Maps uses an array-like syntax for indexing
 - `Currency[Greece]` to access a value (currency) associated with a given key (Greece)
 - `Currency [Greece] = new` → to update the value associated with a key “Greece”
- Unlike a standard array, indices for a map need not be consecutive nor even numeric.

Applications

- Student ID (key) → student’s record (name, address, gpa, etc)
- DNS maps a hostname (www.Wikipedia.com) to an IP address, such as 208.215.179.142

Map ADT

- Unlike Python, many other programming languages do not have a built-in mapping data type like dictionary
- We will learn to implement “map” ADT
- At minimum, we should have:
 - `get(k)` → returns the value associated to the key, k
raise Error if key is not present
 - `put(k,v)` → to put the key-value pair (k, v) to the Map

Map ADT

- Minimal implementation using list
- We can create a simple class to hold key-value variables as objects

```
mapping.py x
1 class Entry:
2     def __init__(self, key, value):
3         self.key = key
4         self.value = value
5
6     def __str__(self):
7         return str(self.key) + " : " + str(self.value)
```

```
1 from mapping import Entry
2
3 class ListMappingSimple:
4     def __init__(self):
5         self._entries = []
6
7     def put(self, key, value):
8         for e in self._entries:
9             if e.key == key:
10                 e.value = value
11                 return
12         self._entries.append(Entry(key, value))
13
14     def get(self, key):
15         for e in self._entries:
16             if e.key == key:
17                 return e.value
18         raise KeyError
```

Map ADT

- To implement a complete ADT with collection, we might want to have the following methods:

<code>get(k)</code>	→ return the value associate to the key k, raise error if key is absent
<code>put(k, v)</code>	→ add the key-value pair (k, v) to the mapping
<code>remove(k)</code>	→ remove the entry with key k if it exists
<code>__contains__(k)</code>	→ returns True if the mapping contains a pair with key k
<code>__len__()</code>	→ returns the number of keys in the dictionary

First four functions require list traversing, therefore we can write a separate function to traverse through the map

<code>_entry(k)</code>	→ traverse the map to return the element with key k
------------------------	---

Activity

Based on the functionality given, determine the correct names of methods of Map ADT

```
from mapping import Entry
```

```
class ListMapping:
```

```
    def __init__(self):  
        self._entries = []
```

```
    def _entry(self, key):  
        for e in self._entries:  
            if e.key == key:  
                return e  
        return None
```

```
    def  
        e = self._entry(key)  
        if e is not None:  
            e.value = value  
        else:  
            self._entries.append(Entry(key, value))
```

```
    def  
        if self._entry(key) is None:  
            return False  
        else:  
            return True
```

```
    def  
        return len(self._entries)
```

```
    def  
        e = self._entry(key)  
        if e is not None:  
            return e.value  
        else:  
            raise KeyError
```


Activity

Solution

Based on the functionality given, determine the correct names of methods of Map ADT

```
from mapping import Entry
```

```
class ListMapping:
```

```
    def __init__(self):  
        self._entries = []
```

```
    def _entry(self, key):  
        for e in self._entries:  
            if e.key == key:  
                return e  
        return None
```

```
    def  
        e = self._entry(key)  
        if e is not None:  
            e.value = value  
        else:  
            self._entries.append(Entry(key, value))
```

```
    def  
        if self._entry(key) is None:  
            return False  
        else:  
            return True
```

```
    def  
        return len(self._entries)
```

```
    def  
        e = self._entry(key)  
        if e is not None:  
            return e.value  
        else:  
            raise KeyError
```

Map ADT

- Elements are stored as objects in the list
→ Searching a particular key requires $O(n)$ time complexity
- How dictionary has $O(1)$ time complexity for all operations?
- Python Dictionary is implemented with another data structure

Hash Tables

- The most practical data structure to implement “map”
- Used in Python’s `dict` class implementation.
- Consider the following map with “indices” as keys

M		Sue			Tim	Ali	Mia	Sam			
	0	1	2	3	4	5	6	7	8	9	10

- Values can be accessed in $O(1)$ time
- Example:
 - Access value: $M[5] \rightarrow \text{Ali}$
 - Update a value $M[7] = \text{Sameer}$

Hash Tables

- What if the value to be saved has a key with big number, e.g. 1002

M		Sue			Tim	Ali	Mia	Sam			...	Amy
	0	1	2	3	4	5	6	7	8	9	...	1002

- Require a big chunk of memory reserved for M while wasting the intermediate empty memory locations

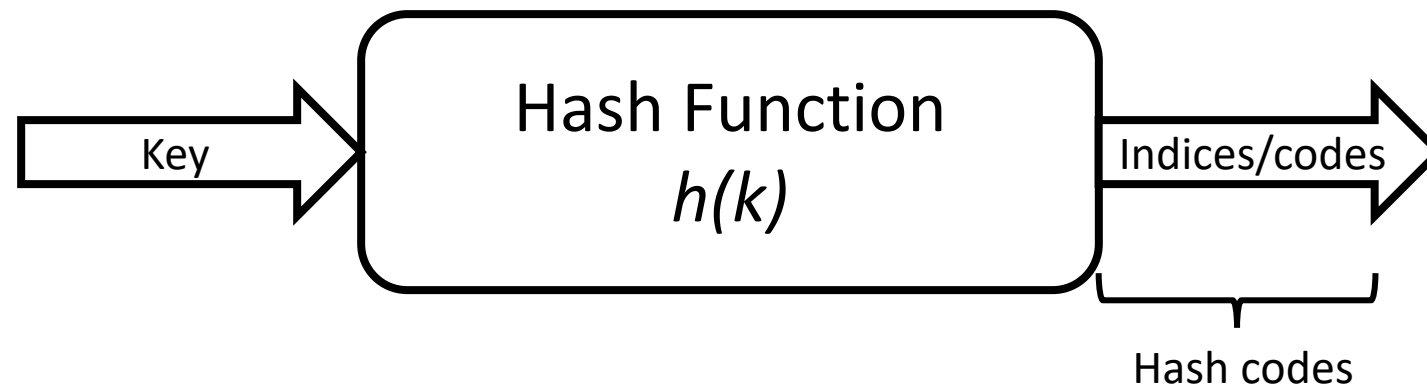
Challenges

- Do not want to allocate a large space N to hold only small amount of elements n ($N \gg n$) \rightarrow inefficient implementation
- Do not usually/always have keys as integer values



Hash Tables

- We can pass any “type” of key into a mechanism to convert it into indices/codes



- The goal of a hash function, h , is to map each key, k , to an integer in the range $[0, N - 1]$
 - $N \rightarrow$ capacity of a hash table

Hash Tables

Hash Function

- There are many different strategies to generate hash code
 - One way: take ASCII value of all characters in a string and calculate the sum of them
 - Example: For “Tim”, ASCII value of:
 - T = 84
 - i = 105
 - m = 109
 - ➔ Sum = 298

How can we store “Tim” with key 298 in the map, M, containing N=11 memory locations?

Take modulo with size of M ➔ $298 \% 11 \rightarrow 1$



Hash Tables

Hash Function

- Similarly,
 - Ali $\rightarrow 65 + 108 + 105 = 278 \rightarrow 278 \% 11 \rightarrow 3$
 - Sue $\rightarrow 83 + 117 + 101 = 301 \rightarrow 301 \% 11 \rightarrow 4$
 - Mia $\rightarrow 77 + 105 + 97 = 279 \rightarrow 279 \% 11 \rightarrow 4$

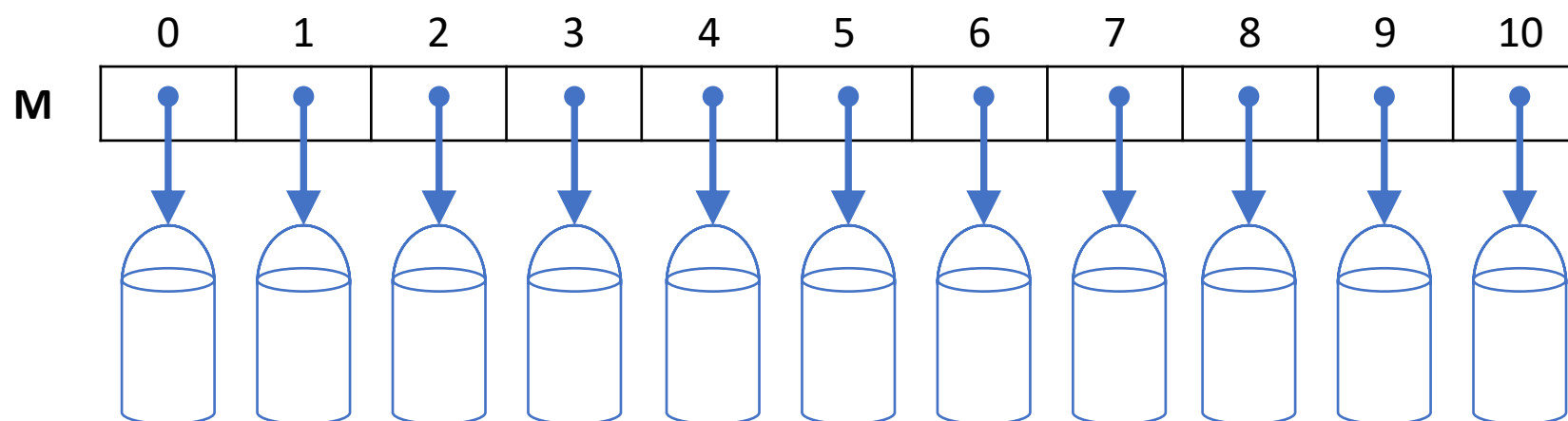
M		Tim		Ali	Sue						
	0	1	2	3	4	5	6	7	8	9	10

- The same key is generated again which has been used before
 \rightarrow **Hash Collision**

Hash Tables

Collision-Handling Schemes

- Conceptualize hash-table as Bucket Array



- We can store multiple items in any specific bucket



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Quick Recap

- Completed sorting algorithms
 - Discussed time complexity of quick sort: $O(n \log n)$ and $O(n^2)$
- Mapping \rightarrow association between two objects \rightarrow key-value pairs
 - Python has dictionary data structure to hold key-value pairs
- Developed a simple Map ADT with lists having `get(k)`, `put(k, v)` methods

Quick Recap

- Entry Class to hold key-value pairs

```
mapping.py  x
1 class Entry:
2     def __init__(self, key, value):
3         self.key = key
4         self.value = value
5
6     def __str__(self):
7         return str(self.key) + " : " + str(self.value)
```

- ListMapping ADT

```
from mapping import Entry
```

```
class ListMapping:
    def __init__(self):
        self._entries = []
```

```
def put(self, key, value):
    e = self._entry(key)
    if e is not None:
        e.value = value
    else:
        self._entries.append(Entry(key, value))
```

```
def get(self, key):
    e = self._entry(key)
    if e is not None:
        return e.value
    else:
        raise KeyError
```

```
def __contains__(self, key):
    if self._entry(key) is None:
        return False
    else:
        return True
```

```
def __len__(self):
    return len(self._entries)
```

```
def _entry(self, key):
    for e in self._entries:
        if e.key == key:
            return e
    return None
```

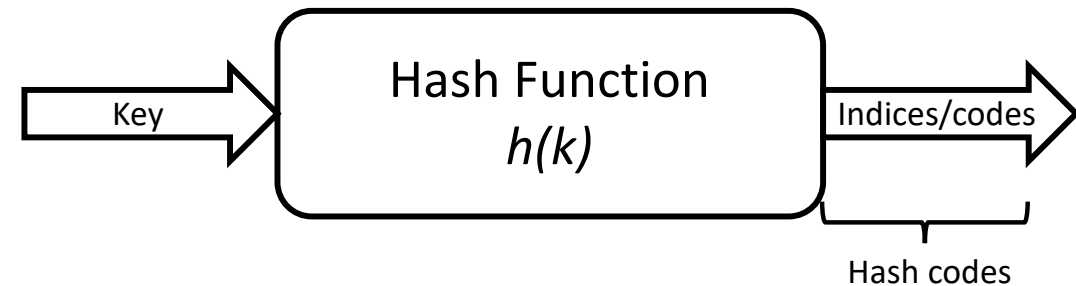


Quick Recap

- Next we considered list “indices” as the keys
 - Problem: storing elements with having big numbers as keys

M		Sue			Tim	Ali	Mia	Sam			...	Amy
	0	1	2	3	4	5	6	7	8	9	...	1002

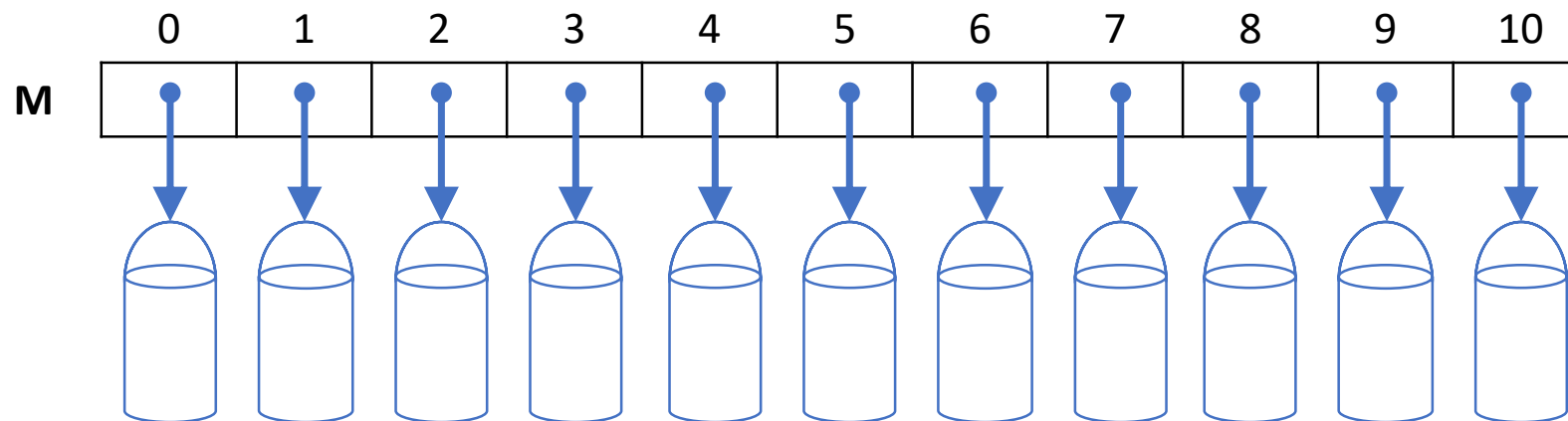
- Requires large amount of memory to store small number of elements
- Keys are not “integers” always



- Different approaches of generating hash codes
 - Summing up the ASCII codes of each character in a key
 - Take a mod to map the key in the hash table of size N

Quick Recap

- Next problem we came across?
 - Hash codes generated for certain keys are same
 - → map different keys at same location → Hash Collision
- Instead of having a single object at each location in hash table, we conceptualized to have buckets



Hash Tables

Collision-Handling Schemes

Separate Chaining

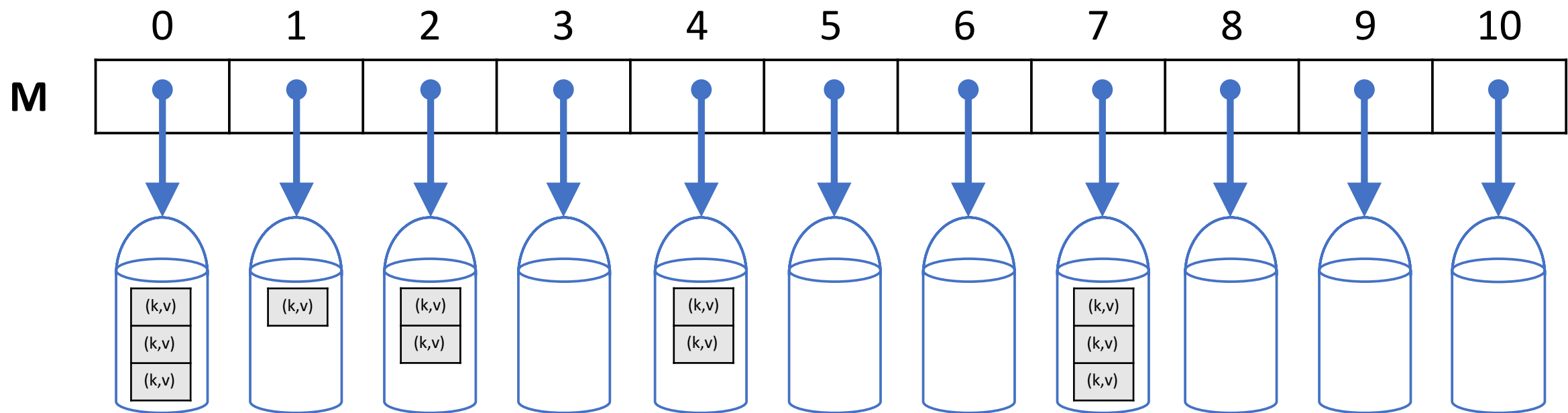
- Have each bucket $M[j]$ store its own container to carry multiple (k, v) items
 - M is the array of buckets
 - j is the location of j^{th} bucket
- $h(k) = j \rightarrow$ hash code

Hash Tables

Collision-Handling Schemes

Separate Chaining

- Have each bucket $M[j]$ store its own container to carry multiple (k, v) items
 - Natural choice of a second container at each location would be a list/linked-list
 - We can use the same `ListMapping` container which we have already created



Hash Tables

Collision-Handling Schemes

Separate Chaining

Implementation

1. Create a HashTable of size 10

	0	1	2	3	4	5	6	7	8	9
HashTable										

```
class HashTable:  
    def __init__(self):  
        self._htsize = 10
```

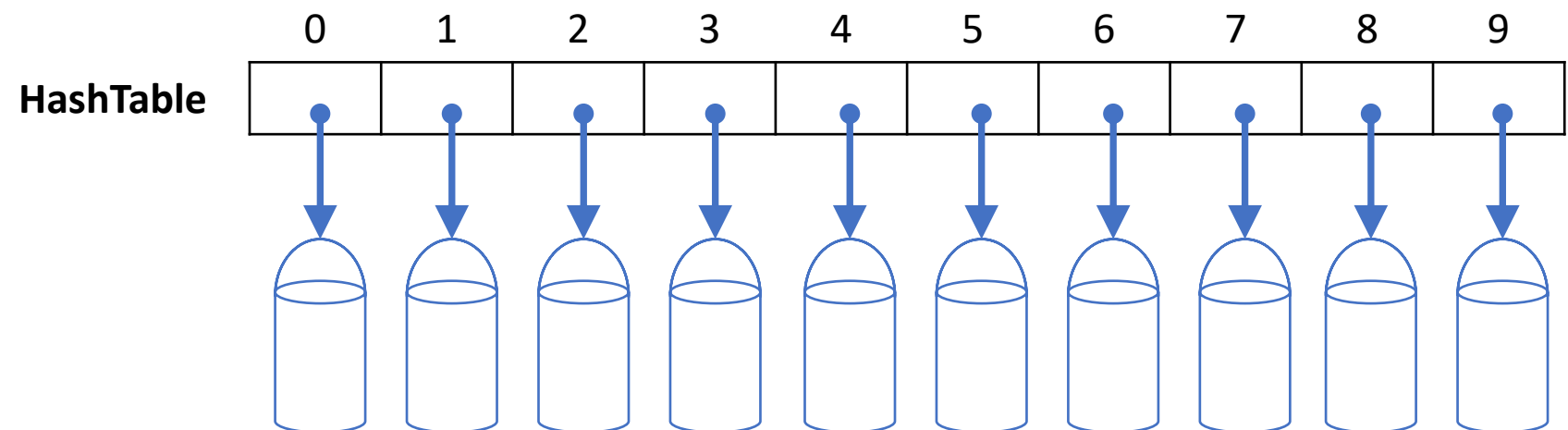

Hash Tables

Collision-Handling Schemes

Separate Chaining

Implementation

2. Create 10 buckets (bucket array) each containing secondary structure (ListMapping)



```
from ListMapping import ListMapping
```

```
class HashTable:
```

```
    def __init__(self):
```

```
        self._htsize = 10
```

```
        self._buckets_array = [ListMapping() for i in range(self._htsize)]
```

Hash Tables

Collision-Handling Schemes

Separate Chaining

Implementation

3. Putting a key-value pair in the bucket

- Get the bucket first
 - Generate a hash function for the key → using Python's built-in `hash` function
 - Take a modulo with the size of a hash table to calculate j^{th} index (bucket location)
 - Return j^{th} bucket
- Put the key-value pair in the j^{th} bucket

4. Retrieving a value

- Get the bucket (using the same above procedure) and return the value associated to the key

Activity

Implement the following methods in `HashTable` class

`put(self, key, value)`: to put a key-value pair in the bucket

- Get the bucket first
 - Generate a hash function for the key → using Python's built-in `hash` function
 - Take a modulo with the size of a hash table to calculate j^{th} index (bucket location)
 - Return j^{th} bucket
- Put the key-value pair in the j^{th} bucket

`get(key)`: to retrieve the value associated with the key

- Get the bucket (using the same above procedure) and return the value associated to the key

Activity

Solution

Implement the following methods in HashTable class

put(self, key, value): to put a key-value pair in the bucket

```
def put(self, key, value):  
    bucket = self._get_bucket(key)  
    bucket.put(key, value)  
    # bucket[key] = value
```

```
def _get_bucket(self, key):  
    j = hash(key) % self._htsize  
    return self._buckets_array[j]
```

get(key): to retrieve the value associated with the key

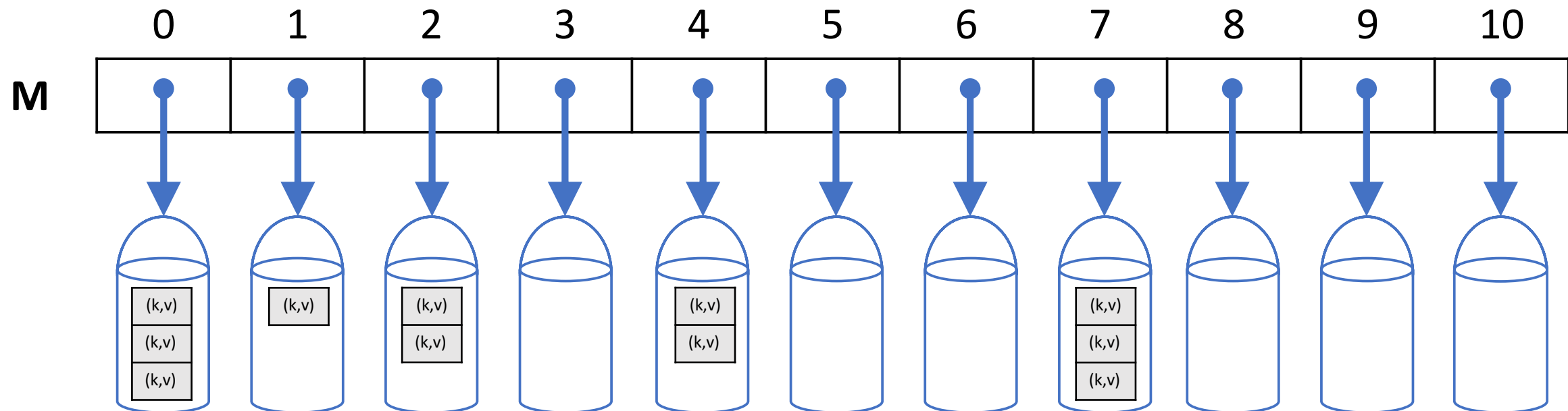
```
def get(self, key):  
    bucket = self._get_bucket(key)  
    return bucket.get(key)
```

Hash Tables

Collision-Handling Schemes

Separate Chaining

- In Worst case:
 - Time to search for the bucket is $O(1)$
 - Time to search a key in the bucket depends on the size of bucket: For size $m \rightarrow O(m)$



Hash Tables

Collision-Handling Schemes

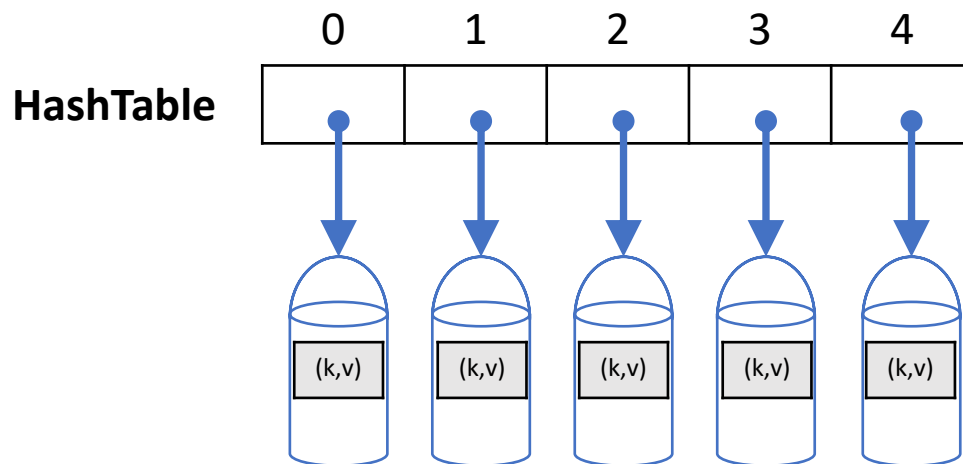
- A good hash function index “n” items of a map in a bucket array of capacity “N”
→ The expected size of a bucket is n/N
- The ration $\lambda = n/N$ is called “**Load Factor**” of the hash table
 - Bounded by a small constant (preferably below 1)
- Example:
 - $n = 15$
 - $N = 10$
 - $\lambda = 1.5 \rightarrow$ collision

	0	1	2	3	4	5	6	7	8	9
M										

Hash Tables

Collision-Handling Schemes

- Dynamic resizing - Double the size of hash table when load factor increases beyond 1



- Implement a method to double the size of hash table
 - Python resizes hash table when Load factor > 0.66
- After resizing, all the items in the old hash table has to be added in the new hash table
 $\rightarrow O(n)$

Hash Tables

Collision-Handling Schemes

Open Addressing

- The nice property of chaining method is its easy implementation
 - Drawback → requires auxiliary data structure – list to hold items with colliding keys
- For applications where space is an issue (like hand-held devices)
 - We can consider storing each item in a separate table slot
 - Load factor is always at most required to be 1
 - Dealing with “collisions” becomes more complicated
- This approach of storing each element in a separate bucket in the bucket array (hash table) having a load factor of at most 1 is called “Open Addressing”.

Hash Tables

Collision-Handling Schemes

Open Addressing

- There are couple of variants of Open Addressing

Linear Probing

- Inserting an element (k,v) at $M[j]$
 - j is the index generated by hash function
- If j^{th} place is occupied, we try $M[(j+1) \% N]$
- If this place is also occupied, we next try $M[(j+2) \% N]$, and so on

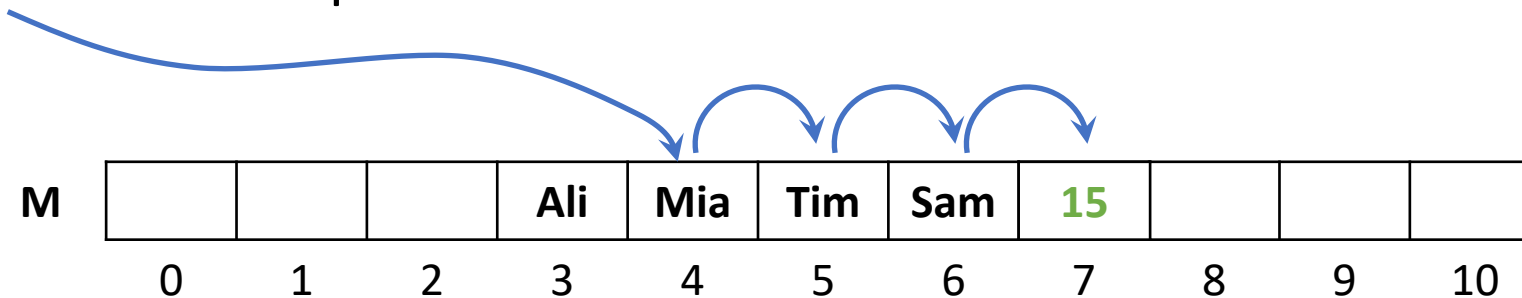
Hash Tables

Collision-Handling Schemes

Open Addressing

Linear Probing – Example

- Inserting a new element with key $k = 15 \rightarrow k \bmod N \rightarrow 15 \bmod 11 = 4$
- This new item should be placed at location 4



- This requires additional implementation to search for an existing key
- Accessing cell array is analogous to probing the bucket to find its content

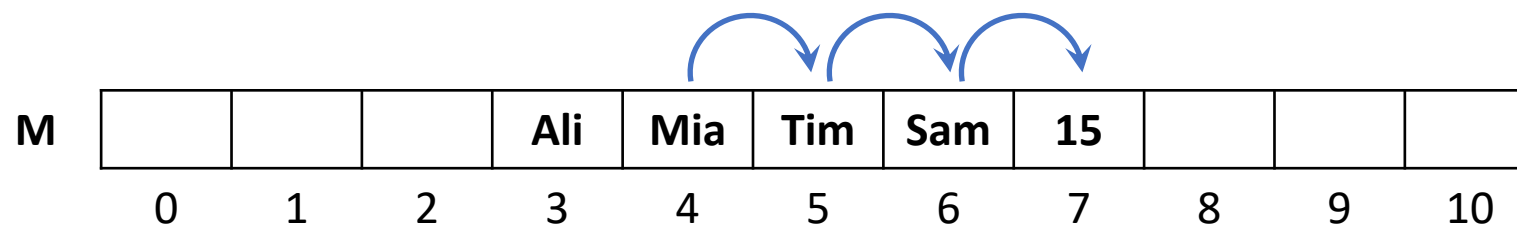
Hash Tables

Collision-Handling Schemes

Open Addressing

Linear Probing – Searching

- To locate items in the hash-table, we start off by reading a key from $M[h(k)]$
- Then keep moving forward until either the element is found or an empty space is encountered



Hash Tables

Collision-Handling Schemes

Open Addressing

Linear Probing – Deleting

- Item cannot be simply deleted as soon as it is located

M				Ali	Mia	Tim	Sam				
	0	1	2	3	4	5	6	7	8	9	10

- Deleted location has to be masked with "sentinel"