

Hashing: subset of dictionary operations: add, contains, remove.

A function h , known as hash function, maps elements to non-negative integers in $[0, n-1]$ where the table size is chosen to be n . Then x will be placed in $\text{table}[h(x)]$, if possible.

Design goals:

1. Choose n proportional to number of elements in dictionary: $\lambda = \text{size} / n$, the load factor, is $O(1)$.
2. For any two keys x and y , $\Pr\{h(x) = h(y)\} = 1/n$.
3. Pseudorandom function: $h(1), h(2), h(3), \dots$ should be indistinguishable from a random sequence.
4. Deterministic, and easy to compute.

Implementation sketch:

add(x): Place x in $\text{table}[h(x)]$	contains(x): Is x in $\text{table}[h(x)]$?	remove(x): remove x from $\text{table}[h(x)]$
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Collision resolution: What do you do if $\text{add}(x)$ finds $\text{table}[h(x)]$ is already occupied by another element?

- (1) Separate chaining (known as open hashing): each entry of the hash table is a linked list of elements.
- (2) Open addressing (closed hashing): each entry of the hash table can store only one element (or a small, fixed number of elements). Many schemes are available for collision resolution.

Java: Hash tables use separate chaining. Hash function is called `hashCode()`, and $h(x)$ is a function of $x.\text{hashCode}()$ and n . Table size is automatically adjusted based on load factor, and system tries to keep the load factor to be less than 0.5. In the base class of the object hierarchy, `Object`, `hashCode` is defined to be the address of the object. This is not a good hash function. Wrapper classes override it. User-defined classes that need to be used as keys in hashing should implement `hashCode()` and `equals()` methods.

The lengths of Java's hash tables are powers of 2 to simplify calculations. Bit operations are used to mangle the integer given by `hashCode()` to avoid problems created by poorly defined hash functions.

```
// Code extracted from Java's HashMap:
static int hash(int h) {
    // This function ensures that hashCodes that differ only by
    // constant multiples at each bit position have a bounded
    // number of collisions (approximately 8 at default load factor).
    h ^= (h >>> 20) ^ (h >>> 12);
    return h ^ (h >>> 7) ^ (h >>> 4);
}
static int indexFor(int h, int length) {    // length = table.length is a power of 2
    return h & (length-1);
}
// Key x is stored at table[ hash( x.hashCode() ) & ( table.length - 1 ) ].
```

Java hash tables: `HashSet`, `HashMap`, `LinkedHashSet`, `ConcurrentHashMap`, `HashTable`.

HashSet: implementation of `Set` interface. Main operations: `add`, `contains`, `remove`, `iterator`. `add(x)` is rejected if x is already in the set. `HashSet` is implemented using `HashMap`.

HashMap: Implementation of `Map` interface (key/value pairs). Main ops: `get`, `put`, `containsKey`, `remove`, `iterator`. `put` operation replaces value if key already exists in map. `get` returns null if key does not exist.

LinkedHashSet: like `HashSet`, but `iterator` goes through elements in order of `add`.

ConcurrentHashMap, HashTable: synchronized, suitable for multi-threaded applications.

Hashing

Java HashMap

$$h(x) = \text{indexFor} \left(\text{hash}(\text{hashCode}(x)), \text{table.length} \right)$$

table.length is a power of 2.

Hash tables in Java

1. HashSet:

HashSet<Vertex> set = new HashSet<>();

Operations: add(x), contains(x), remove(x),
iterator() - no order is guaranteed

2. HashMap: Key, Value pairs.

HashMap<Vertex, Integer> map = new HashMap<>();

Operations: get(x) - value associated with key x.
(null if no such key exists)

put(x, value) - associate a new value
with key x.

put returns old value associated
with x.

iterator: Map.Entry<K, V>.

```
for (Map.Entry<Vertex, Integer> ent :  
    map.entrySet())  
    Vertex u = ent.getKey();  
    Integer val = ent.getValue();  
    ;  
}
```

Typical application: Given an array of integers, return a list of its distinct elements.

```
List<Integer> unique distinctElement, (int[] arr) {  
    Set<Integer> set = new HashSet<>();  
    for (Integer e: arr) { set.add(e); }  
    List<Integer> result = new ArrayList<>();  
    for (Integer e: set) { result.add(e); }  
    return result;  
}
```

$O(n)$ expected time

Generalize integers \rightarrow arbitrary classes.

If user-defined class C is used as a HashSet/Map key, then C should implement:

public int hashCode() \rightarrow hash code of object.

public boolean equals(Object other) {...}

- whether this object is equal to other object.

Implementation of HashSet/HashMap in Java:
~ Separate chaining.

- each table location is a linked list of elements.

HashSet: List<T> [] table;

add(x): if (table[h(x)].contains(x))
return false;
else { table[h(x)].add(x);
return true;
}

contains(x): return table[h(x)].contains(x);

remove(x): return ~~remove~~ table[h(x)].remove(x);

iterator(): chained iterator of the lists' iterators.

↳ Iterator object: int index;
Iterator<T> iter;

↗
iterator of table[index]

Reality: It is not really a list.

→ TreeMap hacked to have compareTo() and allow equal keys.

Tables are automatically resized when load factor exceeds some threshold.

Open addressing collision resolution schemes: Each entry of the hash table can store a fixed number of elements. The algorithms use a sequence of probes at indexes i_0, i_1, \dots, i_k . Probing stops when $\text{table}[i_k]$ contains x , or, it is free. When an element is removed, that element of the table is marked as “deleted”. The table is periodically reorganized when the load factor crosses a threshold (say, 0.5), or when a probing sequence is longer than some prescribed value. Elements are rehashed into the table, possibly with new hash functions, and deleted entries are marked as “free”.

Linear probing: $i_k = (h(x) + k) \% n$. Advantage: simple algorithm. Disadvantage: clustering of nodes.

Quadratic probing: $i_k = (h(x) + k^2) \% n$. Better than linear probing, but elements with $h(x) = h(y)$ have the same probing sequence, and this leads to secondary clustering.

Double-hashing: a second hash function (h_2) is used to determine step length: $i_k = (h(x) + k * h_2(x)) \% n$.

```
find( x ): // search for x and return index of x. If x is not found, return index where x can be added.
```

```
  k ← 0
```

```
  while true do
```

```
    if table [  $i_k$  ] = x or table [  $i_k$  ] is free then return  $i_k$ 
```

```
    else if table [  $i_k$  ] is deleted then break
```

```
    else k++
```

```
  xspot ←  $i_k$ 
```

```
  while true do
```

```
    k++
```

```
    if table [  $i_k$  ] = x then return  $i_k$ 
```

```
    if table [  $i_k$  ] is free then return xspot
```

```
contains( x ):
```

```
  loc ← find( x )
```

```
  if table [ loc ] = x then return true
```

```
  else return false
```

```
add( x ):
```

```
  loc ← find( x )
```

```
  if table [ loc ] = x then return false
```

```
  else { table [ loc ] ← x; return true }
```

```
remove( x ):
```

```
  loc ← find( x )
```

```
  if table [ loc ] = x then
```

```
    result ← table [ loc ]
```

```
    mark table [ loc ] as deleted
```

```
    return result
```

```
  else return null
```

Chaining

Key	$h(x)$
12497	14
28754	7
34678	3
45500	14
56699	3
67891	4
70011	15
81209	3
99194	14
18608	7

0	
1	
2	
3	34678 → 56699 → 81209
4	67891
5	
6	
7	28754 → 18608
8	
9	
10	
11	
12	
13	
14	12497 → 45500 → 99194
15	70011

Linear probing

Key	$h(x)$
12497	14
28754	7
34678	3
45500	14
56699	3
67891	4
70011	15
81209	3
99194	14
18608	7

0				70011	
1					99194
2					
3	34678				
4		56699			
5			67891		
6				81209	
7	28754				
8			18608		
9					
10					
11					
12					
13					
14	12497				
15		45500			

Quadratic probing

Key	$h(x)$
12497	14
28754	7
34678	3
45500	14
56699	3
67891	4
70011	15
81209	3
99194	14
18608	7

0		70011	
1			
2			
3	34678		
4		52699	
5		67891	
6			
7	28754		
8		99194	2011
9			
10			
11		18608	
12			81209
13			
14	12497		
15		45500	

Double hashing

Key	$h_1(x)$	$h_2(x)$
12497	14	5
28754	7	2
34678	3	7
45500	14	7
56699	3	1
67891	4	2
70011	15	3
81209	3	5
99194	14	3
18608	7	5

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	
10	
11	
12	
13	
14	
15	