

## **CHAPTER 8**

# Hashing

# Contents

8.1 Introduction

8.2 Static Hashing

8.3 Dynamic Hashing

- ADT dictionary

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**ADT Dictionary** is

**objects:** a collection of  $n > 0$  pairs, each pair has a key and an associated item

**functions:**

for all  $d \in \text{Dictionary}$ ,  $item \in \text{Item}$ ,  $k \in \text{Key}$ ,  $n \in \text{integer}$

*Dictionary* Create( $max\_size$ ) ::= create an empty dictionary.

*Boolean* IsEmpty( $d, n$ ) ::= if ( $n > 0$ ) return *FALSE*

else return *TRUE*

*Element* Search( $d, k$ ) ::= return item with key  $k$ ,

return NULL if no such element.

*Element* Delete( $d, k$ ) ::= delete and return item (if any) with key  $k$ ;

*void* Insert( $d, item, k$ ) ::= insert *item* with key  $k$  into  $d$ .

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**ADT 5.3:** Abstract data type *dictionary*

- Applications of dictionaries

- Spelling checker
- Data dictionary
- Symbol tables

사전

- Representation of dictionary
  - Binary search tree (chapter 5)
  - Balanced BST (chapter 10)
- Operations: search, insert, delete
  - $O(n)$  time: for a BST  $\rightarrow$  skewed
  - $O(\log n)$  time using a balanced BST
- Hashing
  - A technique that performs the dictionary operations search, insert and delete in  $O(1)$  expected time
  - Static hashing, dynamic hashing

## **8.2 STATIC HASHING**

## 8.2.1 Hash Tables

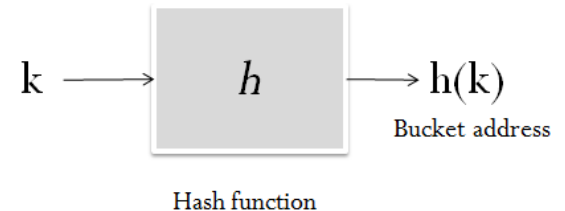
- Dictionary pairs
  - Stored in a table  $ht$ , called the **hash table**
- Hash table
  - Partitioned into  **$b$  buckets**:  $ht[0], \dots, ht[b-1]$
  - Each bucket consists of has  **$s$  slots**
    - Each slot holds one dictionary pair
  - The address or location of a pair whose key is  $k$  is determined by a hash function,  $h$

hash function 이 key를 넣으면  
hash table의 address가 나옴

- Hash function

- $h(k)$  : integer in the range 0 through  $b-1$ 
  - hash or home address of key  $k$

→ 테이블의 index



- Definition:

- The **key density** of a hash table:  $n/T$

- $n$ : # of pairs in the table *table에 있는 key의 개수*

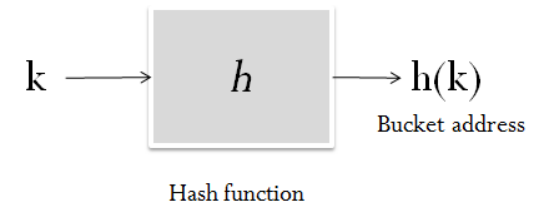
- $T$ : The total # of possible keys *모든 가능한 key의 개수* *용량*

- The **loading density** (factor) of a hash table:  $\alpha = n/(sb)$

- $s$ : # of slots *슬롯의 개수*

- $b$ : # of buckets

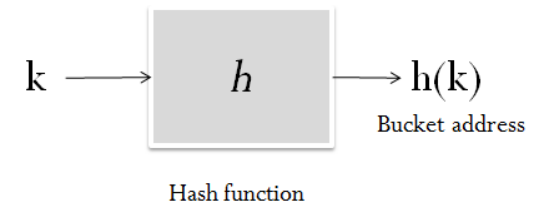
*→ 현재 버킷에서 사용하고있는 버킷의 개수*



- Suppose that keys are at most six characters long
  - The first character: a letter
  - The remaining characters: letters or digits
  - The # of possible keys :  $T = \sum_{i=0}^5 26 \times 36^i > 1.6 \times 10^9$
  - But, most applications use only very small fraction of it;
  - Key density  $n/T$  is usually very small
- The number of buckets  $b$  is also much less than  $T$ 
  - Hash function  $h$  maps several different keys into the same bucket  $\rightarrow h(k_1) = h(k_2)$
- If  $h(k_1) = h(k_2)$ 
  - Two keys  $k_1$  and  $k_2$  are said to be *synonyms*

key 같은데, 해쉬함수의 값은 같음  
이때 두 key를 synonyms라고 함





- **Overflow**

- Home bucket is full at the time we wish to insert a new pair into the dictionary

- **Collision**

*bucket 이 이미 찼을때..*

- Occurs when the home bucket for a new pair is not empty at the time of insertion

- **If each bucket has 1 slot**

- collisions and overflows occur at the same time

- Ex 8.1) Hash table

(key)  
Type 1074

- $b=26$  buckets and  $s=2$  slots, distinct identifiers  $n=10$ 
  - Loading factor  $\alpha = 10 / 52 = 0.19$
  - distinct identifiers: ‘acos’, ‘define’, ‘float’, ‘exp’, ‘char’, ‘atan’, ‘ceil’, ‘floor’, ‘clock’, ‘ctime’
- Define a hash function,  $h(x)$ , as the first character of  $x$ 
  - $h(\text{“acos”}) = \text{‘a’}$
  - Associate the letters, a-z, with the numbers, 0-25, respectively
- acos and atan, float and floor, ceil and char
  - synonyms
- $h(\text{“clock”})$ 
  - overflow

	Slot 0	Slot 1
0	acos	atan
1		
2	char	ceil
3	define	
4	exp	
5	float	floor
6		
...		
25		

**Figure 8.1:** Hash table with 26 buckets and two slots per bucket

	Slot 0	Slot 1
0	acos	atan
1		
2	char	ceil
3	define	
4	exp	
5	float	floor
6		
...		
25		

Figure 8.1: Hash table with 26 buckets and two slots per bucket

- The time complexity of insert, delete or search if no overflow occurs : ...

$O(1)$

- But, overflows occur for most cases

- Hashing Schemes

- Use a hash function to map keys into hash-table buckets
- Desirable a hash function to use that is both easy to compute and minimizes the number of collisions
- A mechanism to handle overflows is needed

이런 hash function을 쓴다

hash function을 잘 구현하라

Overflow를 잘 해결하라

## 8.2.2 Hash Functions

- Hash function :  $h(k) = i$ 
  - Maps a key  $k$  into a bucket  $i$  in the hash table
- The desired properties
  - Easy to compute
  - Minimize the # of collisions
  - Unbiased;
  - **Uniform** hashing function
    - Probability of  $h(k) = i$  is  $1/b$  for all buckets  $i$
    - $k$ : a key chosen at random from the key space

해시 함수에 같은 값을 넣으면 충돌값이 곧바로 나옴

- Popular Hashing Functions
  - Division
  - Mid-square
  - Folding
  - Digit Analysis

# Hash Functions : Division

- The most widely used hash function in practice
- Home bucket  $h(k) = k \% \boxed{D}$  <sup>bucket의 개수</sup>
  - $k$ : nonnegative,  $D$ : some number
  - Bucket :  $0 \sim D-1$
  - Hash table must have at least  $D(=b)$  buckets

- The choice of  $D$  is critical
  - If  $D$  is divisible by 2, then odd (even) keys are mapped to odd (even) buckets; biased
    - $20\%14 = 6, 30\%14 = 2, 8\%14 = 8$
    - $15\%14 = 1, 3\%14 = 3, 23\%14 = 9$
  - The distribution is biased whenever  $D$  has small prime factors

*unbiased는 h(k)를 바꿔함*
  - Ideally, choose  $D$  so that it is a prime number
  - Alternatively, choose  $D$  so that it has no prime factor smaller than 20
- Is it practical? ...

- The relaxed requirement on  $D$ 
  - Use odd  $D$  and set  $b$  equal to  $D$
  - As the size of the dictionary grows, it will be necessary to increase the size of the hash table  $ht$  dynamically;
  - *Array doubling* results in increasing the # of buckets (and hence divisor  $D$ ) from  $b$  to  $2b + 1$



# Hash Functions : Mid-Square

- $h(k) = \text{middle}(k^2)$ 
  - Square the key and then use an appropriate # of bits from the middle of the square
  - The middle bits of the square usually depend upon all the characters in an identifier
    - Different identifiers will produce different hash addresses
  - If  $r$  bits are used, then the size of hash tables
    - ...

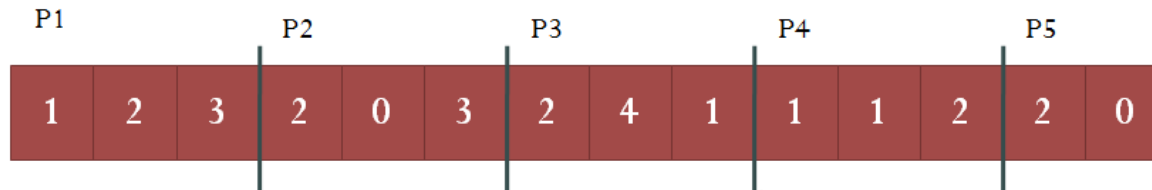
$$\begin{array}{r} 10100 \\ \times 10100 \\ \hline 00110010000 \end{array}$$

Handwritten annotations in red:  $20$  (twice) and  $400$ . The middle bits **10010** of the result are highlighted in blue.

# Hash Functions : Folding

- The key  $k$ 
  - **Partitioned** into several parts, all but possibly the last being of the same length
  - Then **added** together to obtain the hash address for  $k$
- Two schemes
  - Shift folding
  - Folding at the boundaries

- Ex 8.2)  $k = 12320324111220$ 
  - partition it into parts that are three decimal digits long



P1	1 2 3
P2	2 0 3
P3	2 4 1
P4	1 1 2
P5	2 0

---

6 9 9

Shift folding:  
 $h(k)=699$

P1	1 2 3
P2	3 0 2
P3	2 4 1
P4	2 1 1
P5	2 0

---

8 9 7

Folding at the boundaries:  
 $h(k)=897$

# Hash Functions : Digit Analysis

- Useful in a static file
  - where all the keys in the table are known in advance
- Method
  - Each key is interpreted as a number using some radix  $r$
  - The digits of each key are examined
  - Digits having the most skewed distributions are deleted
    - remaining digits: an address of the hash table

542-42-2241  
542-81-3678  
542-22-8171  
542-38-9671  
542-54-1577  
542-88-5376  
542-19-3552

422, 836, 281,  
396, 515, 853,  
135.

가장 분포를 나타내는 곳을  
찾아서 바이트 주소로 활용  
(index)

# Converting Keys to Integers

- Hash keys
  - Need to be converted to nonnegative integer

---

```
unsigned int stringToInt(char *key)
{
    /* simple additive approach to create a natural number
       that is within the integer range */
    int number = 0;
    while (*key)
        number += *key++;
    return number;
}
```

---

**Program 8.1:** Converting a string into a non-negative integer

key: 8 characters  
→ integer up to 11 bits long

---

```
unsigned int stringToInt(char *key)
{
    /* alternative additive approach to create a natural number
       that is within the integer range */
    int number = 0;
    while (*key)
    {
        number += *key++;
        if (*key) number += ((int) *key++) << 8;
    }
    return number;
}
```

---

**Program 8.2:** Alternative way to convert a string into a non-negative integer

# Hashing

- 8.1 Introduction
- 8.2 Static Hashing
  - Hash Tables
  - Hashing Functions
  - **Overflow Handling**
    - Open addressing : Linear probing , Quadratic probing, Rehashing, Random probing
    - Chaining
- 8.3 Dynamic Hashing

# Overflow Handling

→ 이미 bucket이 차있어

- Linear Probing

- Inserting a new pair ( $k$ )

- Search the hash table buckets in the order,  $ht[h(k) + i] \% b$ ,  
where  $0 \leq i \leq b-1$

↓ 대체한 결과

$$ht[(h(k) + i) \% b]$$

→ bucket의 시작  
hash table의 size

- This search terminates when we reach the first unfilled bucket  
and the new pair is inserted into this bucket

번 bucket을 만나면 종료

근데로  
못 찾으면?

- In case no such bucket is found: hash table is full

완전 꽉찬거..

- It is necessary to increase the table size → size를 늘려

- Table size is increased when the loading density exceeds a pre-specified threshold (ex: 0.75)

- Resizing the hash table

- We must change the hash function; ⇒ hash table을 바꾼다는 것은 hash function을 바꾼다는 것
    - All dictionary entries need to be remapped into the new larger table



- Ex 8.4)
  - 13-bucket table with one slot per bucket
    - Using  $h(k) = k \% D$  <sub>13</sub> : *DIVISION*
  - words: *for, do, while, if, else, function*

Identifier	Additive Transformation	x	Hash
<i>0157</i> <i>7524</i> for	<i>102</i> + 111 + 114	327	2
do	100 + 111	211	3
while	119 + 104 + 105 + 108 + 101	537	4
if	105 + 102	207	12
else	101 + 108 + 115 + 101	425	9
function	102 + 117 + 110 + 99 + 116 + 105 + 111 + 110	870	<b>12</b>

*Overflow*

```

unsigned int stringToInt(char *key)
{
    /* simple additive approach to create a n
       that is within the integer range */
    int number = 0;
    while (*key)
        number += *key++;
    return number;
}

```

**Program 8.1:** Converting a string into a non-negative integer

<b>[0]</b>	<b>function</b>
[1]	
[2]	<b>for</b>
[3]	<b>do</b>
[4]	<b>while</b>
[5]	
[6]	
[7]	
[8]	
[9]	<b>else</b>
[10]	
[11]	
<b>[12]</b>	<b>if</b>

Using a circular rotation,  
the next available bucket is  
at ht[0] *공공에 0이 바뀌었음..*

- Hash Table Search

- when  $s = 1$  and linear probing is used to handle overflows

- (1) Compute  $h(k)$ .
- (2) Examine the hash table buckets in the order  $ht[h(k)]$ ,  $ht[(h(k) + 1) \% b]$ ,  $\dots$ ,  $ht[(h(k) + j) \% b]$  until one of the following happens:
  - (a) The bucket  $ht[(h(k) + j) \% b]$  has a pair whose key is  $k$ ; in this case, the desired pair has been found.
  - (b)  $ht[h(k)]$  is empty;  $k$  is not in the table.
  - (c) We return to the starting position  $ht[h(k)]$ ; the table is full and  $k$  is not in the table.

└  $h(k)$  (function)

```
element* search(int k)
{
    /* search the linear probing hash table ht (each bucket has exactly one slot) for k,
    if a pair with key k is found, return a pointer to this pair;
    otherwise, return NULL */
    int homeBucket, currentBucket;
    homeBucket = h(k); 12
    for(currentBucket = homeBucket; ht[currentBucket]
        && ht[currentBucket]->key != k;) {
        currentBucket = (currentBucket + 1) % b;
        /* treat the table as circular */
        if(currentBucket == homeBucket)
            return NULL; /* back to start point */
    }
    if(ht[currentBucket]->key == k)
        return ht[currentBucket];
    return NULL;
}
```

[0]	<b>function</b>
[1]	
[2]	<b>for</b>
[3]	<b>do</b>
[4]	<b>while</b>
[5]	
[6]	
[7]	
[8]	
[9]	<b>else</b>
[10]	
[11]	
[12]	<b>if</b>

Program 8.3: Linear probing

- Linear probing
  - Keys tend to cluster together
- Suppose input sequence:
  - acos, atoi, char, define, exp, ceil, cos, float, atol, floor, ctime
- Hash function
  - $h(x)$ : the first character of  $x$
- When we try to enter “atol”
  - ...

---

bucket	$x$	buckets searched
0	acos	1
1	atoi	2
2	char	1
3	define	1
4	exp	1
5	ceil	4
6	cos	5
7	float	3
8	atol	9
9	floor	5
10	ctime	9
...		
25		

---

**Figure 8.4:** Hash table with linear probing (26 buckets, one slot per bucket)

- Input : acos, atoi, char, define, exp, ceil, cos, float, atol, floor, ctime
- Average # of key comparisons  
=  $41/11 = 3.73$
- Keys tend to cluster together
  - Increase the search time
- Improvements ...

Enter: ~~define~~ ~~define~~

bucket	$x$	buckets searched
→ 0		
→ 1		
→ 2		
→ 3		
→ 4		
→ 5		
→ 6		
→ 7		
→ 8		
→ 9		
→ 10		
...		
25		

Fig 8.4: Hash table with linear probing  
(26 buckets, 1 slot/bucket)

- If using linear probing + **uniform hash function**

- The expected average number of key comparisons

$$p = (2-\alpha)/(2-2\alpha)$$

- $\alpha$ : Loading density

- In Fig 8.4:

$$\alpha = 11/26 = 0.42$$

$$p = 1.36$$

- The worst-case number of comparisons:  
 $O(n)$

bucket	$x$	buckets searched
0	<b>acos</b>	1
1	<b>atoi</b>	2
2	<b>char</b>	1
3	<b>define</b>	1
4	<b>exp</b>	1
5	<b>ceil</b>	4
6	<b>cos</b>	5
7	<b>float</b>	3
8	<b>atol</b>	9
9	<b>floor</b>	5
10	<b>ctime</b>	9
...		
25		

- Quadratic Probing

- Search  $h(k)$ ,  $(h(k) + i^2) \% b$ ,  $(h(k) - i^2) \% b$ 
  - For  $1 \leq i \leq (b - 1)/2$
- $b$ : a prime number of the form  $4j+3$ , where  $j$  is an integer
  - every buckets are examined

Prime	$j$	Prime	$j$
3	0	43	10
7	1	59	14
11	2	127	31
19	4	251	62
23	5	503	125
31	7	1019	254

---

**Figure 8.5:** Some primes of the form  $4j + 3$

- Rehashing
  - Use a series of hash functions  $h_1, h_2, \dots, h_m$
  - Buckets  $h_i(k)$ ,  $1 \leq i \leq m$  are examined in that order
  
- Random Probing
  - Search for a key  $k$  by examining the buckets in the order  $h(k), (h(k) + s(i)) \% b, 1 \leq i \leq b-1$ 
    - $s(i)$  : a pseudo random number



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