
Hashing Part 1

Why Hashing?

- | Many applications require a dynamic set that supports the operations INSERT, SEARCH and DELETE.
- | $O(1)$ time insertion and searching in best case (many cases in practice)
- | $O(n)$ time insertion and searching in worst case.

Direct-Address Tables

- | Universe $U = \{0, 1, \dots, m-1\}$ of keys, where m is not too large. No two elements have the same key.
- | Use an array $T[0..m-1]$ as the direct-address table.
 - Direct-Address-Search(T, k)
 return $T[k]$
 - Direct-Address-Insert(T, x)
 $T[\text{key}(x)] := x$
 - Direct-Address-Delete(T, x)
 $T[\text{key}(x)] := \text{nil}$

Properties of Direct-Address Tables

- | $O(1)$ time searching

- | $O(1)$ time insertion

- | $O(1)$ time deletion

- | Table size cannot be very large. Why?

- | Many slots are wasted. Why?

Hash Tables

- | With direct addressing, an element with key k is stored in slot k .
- | With hashing, this element is stored in slot $h(k)$, where h is a hash function.
 - $h: U \rightarrow \{0, 1, \dots, m-1\}$, where $m \ll |U|$.

Collision and Collision Resolution

| ***Collision***: two keys being hashed to the same slot!

| There are methods to *resolve* collision:

- Chaining
- Open addressing

Hashing with Chaining

Maintain a list at each hash slot

Chained-Hash-Insert(T, x)

- Insert x **at the head** of list $T[h(\text{key}(x))]$

Chained-Hash-Search(T, k)

- Search for an element with key k in list $T[h(k)]$

Chained-Hash-Delete(T, x)

- Delete x from the list $T[h(\text{key}(x))]$

See page 278 in textbook...

Hashing with Chaining

- | A hash table of m slots with n elements
- | load factor is $\alpha = n/m$.
- | In the worst-case, insertion takes $O(1)$ time.
- | In the worst-case, searching takes $O(n)$ time.
- | In the worst-case, deletion takes $O(n)$ time.
- | On average, searching and deletion takes $\Theta(1 + \alpha)$ time.

Hashing Part 2

Hashing with Open addressing

- | In open addressing, all elements are stored in the hash table itself.
- | In other words, there is no chain. A slot either contains an element or nil.
- | **There is a systematic way of searching the slots** (in both searching and insertion)
- | Find the next open address.

Probing

| $h: U \times \{0, 1, \dots, m-1\} \rightarrow \{0, 1, \dots, m-1\}$

| probe sequence is $\langle h(k, 0), h(k, 1), \dots, h(k, m-1) \rangle$. Should be a permutation of $\langle 0, 1, \dots, m-1 \rangle$.

| Example: $h(k, j) = (h'(k) + j) \bmod m$, $j=0, 1, \dots, m-1$.

| Here $h'()$ is a hash function itself.

Hash-Insert(T, k): p. 294

```
01:    i := 0
02:    repeat
03:        q := h(k, i)
04:        if T[q] == NIL then
05:            T[q] := k
06:            return q
07:        else    i := i+1
08:    until i == m
09:    error "hash table overflow"
```

Hash-Insert(T, k): p. 294

```
01:    i := 0
02:    repeat
03:        q := h(k, i)
04:        if T[q] == k then
05:            return q
06:        else    i := i+1
07:    until T[q]==NIL or i==m
08:    return NIL
```

Example: Insertion and Searching

| Assume: $h'(k) = k \bmod 13$
 $h(k, i) = (h'(k) + i) \bmod 13$

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	NIL
12	NIL

Example: Insertion and Searching

Hash-Search(T, 50)

$i \leftarrow 0$

$q \leftarrow h(50, 0) = 11$

$T[q] == \text{NIL}$

return NIL

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	NIL
12	NIL

Example: Insertion and Searching

Hash-Insert(T , 50)

$i \leftarrow 0$

$q \leftarrow h(50, 0) = 11$

$T[q] == \text{NIL}$

$T[q] \leftarrow 50$

return 11

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	NIL
12	NIL

Example: Insertion and Searching

Hash-Insert(T , 50)

$i \leftarrow 0$

$q \leftarrow h(50, 0) = 11$

$T[q] == \text{NIL}$

$T[q] \leftarrow 50$

return 11

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	50
12	NIL

Example: Insertion and Searching

Hash-Insert(T , 11)

$i \leftarrow 0$

$q \leftarrow h(11, 0) = 11$

$T[q] == 50$

$i \leftarrow 1$

$q \leftarrow h(11, 1) = 12$

$T[q] == \text{NIL}$

$T[q] \leftarrow 11$

return 12

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	50
12	NIL

Example: Insertion and Searching

Hash-Insert(T , 11)

$i \leftarrow 0$

$q \leftarrow h(11, 0) = 11$

$T[q] == 50$

$i \leftarrow 1$

$q \leftarrow h(11, 1) = 12$

$T[q] == \text{NIL}$

$T[q] \leftarrow 11$

return 12

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	50
12	11

Example: Insertion and Searching

Hash-Search(T, 11)

$i \leftarrow 0$

$q \leftarrow h(11, 0) = 11$

$T[q] == 50 \neq 11$

$i \leftarrow 1$

$q \leftarrow h(11, 1) = 12$

$T[q] == 11$

return 12

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	50
12	11

Example: Insertion and Searching

Hash-Search(T, 24)

$i \leftarrow 0$

$q \leftarrow h(24, 0) = 11$

$T[q] == 50 \neq 24$

$i \leftarrow 1$

$q \leftarrow h(24, 1) = 12$

$T[q] == 11 \neq 24$

$i \leftarrow 2$

$q \leftarrow h(24, 2) = 0$

$T[q] == \text{NIL}$

return NIL

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	50
12	11

Hashing Part 3

Deletion

| Can we just delete a key from the hash table?

| Can we change the table content to NIL (call it Hash-Delete-1)?

| What is the effect on Hash-Search?

| How about Hash-Insert?

Hash-Delete-1(T, k): A **bad** approach

```
01:   if Hash-Search(T, k) != NIL then
02:       q := Hash-Search(T, k)
03:       T[q] := NIL
04:   return
```


Example: First attempt of deletion

Hash-Delete-1(T, 50)

$q \leftarrow \text{Hash-Search}(T, 50) = 11$

$T[11] == \text{NIL}$

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	50
12	11

Example: First attempt of deletion

Hash-Delete-1(T, 50)

$q \leftarrow \text{Hash-Search}(T, 50) = 11$

$T[11] == \text{NIL}$

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	NIL
12	11

Example: First attempt of deletion

Hash-Search(T, 11)

$i \leftarrow 0$

$q \leftarrow h(11, 0) = 11$

$T[q] == \text{NIL}$

return NIL

But 11 is in the table, at location 12!!!

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	NIL
12	11

Deletion

- | How do we solve this problem?
- | Use a special key—**DELETED**.
- | Hash-Insert should be modified accordingly, treating **DELETED** the same as **NIL**.

Hash-Delete(T, k): Using DELETED

```
01:  if Hash-Search(T, k) != NIL then
02:      q := Hash-Search(T, k)
03:      T[q] := DELETED
04:  return
```

Example: Deletion

Hash-Delete(T, 50)

$q \leftarrow \text{Hash-Search}(T, 50) = 11$

$T[11] == \text{DELETED}$

j	T[j]
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	50
12	11

Example: Deletion

Hash-Delete(T , 50)

$q \leftarrow \text{Hash-Search}(T, 50) = 11$

$T[11] == \text{DELETED}$

j	$T[j]$
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	DELETED
12	11

Example: Deletion

Hash-Search(T , 11)

$i \leftarrow 0$

$q \leftarrow h(11, 0) = 11$

$T[q] == \text{DELETED} \neq \text{NIL}$

$i \leftarrow 1$

$q \leftarrow h(11, 1) = 12$

$T[q] == 11$

return 12

It works!!!

j	$T[j]$
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	DELETED
12	11

Hash-Insert(T, k): dealing with DELETED

```
01:    i := 0
02:    repeat
03:        q := h(k, i)
04:        if T[q] == NIL or T[j] == DELETED then
05:            T[q] := k
06:            return q
07:        else    i := i+1
08:    until i == m
09:    error "hash table overflow"
```

Example: Insertion after deletion

Hash-Insert(T , 24)

$i \leftarrow 0$

$q \leftarrow h(24, 0) = 11$

$T[q] == \text{DELETED}$

$T[11] \leftarrow 24$

return 11

j	$T[j]$
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	DELETED
12	11

Example: Insertion after deletion

Hash-Insert(T , 24)

$i \leftarrow 0$

$q \leftarrow h(24, 0) = 11$

$T[q] == \text{DELETED}$

$T[11] \leftarrow 24$

return 11

It works!!!

j	$T[j]$
0	NIL
1	NIL
2	NIL
3	NIL
4	NIL
5	NIL
6	NIL
7	NIL
8	NIL
9	NIL
10	NIL
11	24
12	11

Worst-case time complexities

| Insertion takes $O(m)$ time in the worst-case

| Searching takes $O(m)$ time in the worst-case

| Deletion takes $O(m)$ time in the worst-case

| Please note that the delete algorithm is DIFFERENT from the Linear-Probing-Hash-Delete on p. 303 of the textbook.

Hashing with open addressing

- | A hash table of m slots with n elements
- | load factor is $\alpha = n/m < 1$.
- | The expected number of probs for an unsuccessful search is at most $1/(1-\alpha)$
- | The expected number of probs for a successful search is at most $-1/\alpha \ln(1-\alpha)$

Common methods for open addressing

Linear probing

- $h(k, i) = (h'(k) + i) \bmod m, i=0, 1, 2, m-1$

Quadratic probing

- $h(k, i) = (h'(k) + c_1 i + c_2 i^2) \bmod m, i=0, 1, 2, m-1$

Double Hashing

- $h(k, i) = (h_1(k) + i h_2(k)) \bmod m, i=0, 1, 2, m-1$

Hashing Part 4

Hash functions

| What makes a good hash function?

| Interpreting keys as natural numbers

– pt treated as (112, 116)...ASCII values...

– $\text{key}(\text{pt}) = 112 * 128 + 116 = 14452$

| The division method

| The multiplication method

Hash functions: (1) The division method

| The division method

- $h(k) = k \bmod m$

| Requirements:

- m not a power of 2
- choose m as a prime number not close to a power of 2

Hash functions: (2) The multiplication method

The multiplication method

Let A be a constant in $(0, 1)$. Multiply the key k by A and extract the fractional part of kA . Then we multiply this value by m and take the floor of the result:

$$h(k) = \lfloor m(kA \bmod 1) \rfloor$$

Use $A=(\sqrt{5}-1)/2=0.6180339887$ and m a power of 2.

The value of m is not critical here.

See pages 284-285 in textbook for an example.

$m=16384$, $k=123456$, $h(k)=67$.

Hash functions: (2) The multiplication method

$$h(k) = \lfloor m(kA \bmod 1) \rfloor$$

| $A = (\sqrt{5}-1)/2 = 0.6180339887$, $m = 16384$, $k = 123456$.

| $h(k) = ?$

| $k A = 76300.0041089472$

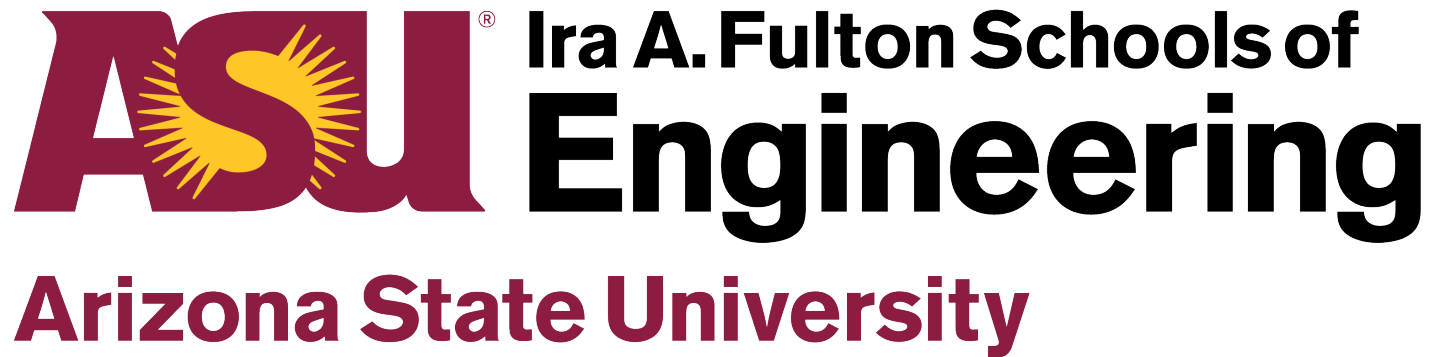
| $(k A) \bmod 1 = 0.0041089472$

| $m ((k A) \bmod 1) = 67.3209909248$

| $h(k) = 67$

Summary

- | Hashing is simple and useful
- | Hash tables
- | Collision resolutions
- | Hash functions



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