

HASH TABLES

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Agenda

1 Dictionaries

2 Hash tables

3 Open hashing

4 Closed hashing

5 Bibliography



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Dictionary ADT

A **set** of elements with the options of **searching**, **insertion** and **deletion**

- Elements are indexed by **comparable** keys

Operations:

- `void clear(Dictionary d);`
- `void insert(Dictionary d, Key k, E e);` // reflect on: multiple entries
- `E remove(Dictionary d, Key k);` // reflect on: multiple entries
- `E removeAny(Dictionary d);` // alternative: `getKeys`
- `E find(Dictionary d, Key k);` // reflect on: multiple entries
- `int size(Dictionary d);`

Implementations: array, linked list,
hash tables, and balanced trees



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Hashing

Space and time trade-off

- Worse space efficiency to get a better time efficiency

Hashing: distributing keys among a one-dimensional array dicionários

- Very efficient way¹ to implement dictionaries
- Hash table: $H[0..m - 1]$
- Hash function: $h : \text{Key} \rightarrow 0..m - 1$

h needs to satisfy somewhat conflicting requirements

- Adequate relation between m and $|\text{Key}|$
- Distribute keys as evenly as possible
- Has to be easy to compute

¹ In terms of temporal efficiency



Hashing

Limitations:

- Not ideal in the presence of **multiple entries** per key
- Not ideal for **accessing** elements based on some **order**
- Not ideal for searching based on a **range of keys**

Hash functions for integers

A trivial attempt²: $h(K) = K \bmod m$

- Let $m = 100$ (hash addresses within 0..99)
- Let $K = 4567$, then $h(K) = 4567 \bmod 100 = 67$

A better approach: the mid-square method

- Compute K^2 , and select the r middle digits, such that $10^r - 1 < m$
- Let $m = 100$ (hash addresses within 0..99), then $r = 2$
- Let $K = 4567$, $K^2 = 20857489$, then $h(K) = 57$

²**Attention** to the implementation of $\bmod : \mathbb{Z} \rightarrow \mathbb{N}$



Hash functions for strings

A first attempt: **fold**

Algorithm: `int h(string K)`

```

1   $s \leftarrow \text{length}(K)$ ;
2   $sum \leftarrow 0$ ;
3  for  $i \leftarrow 0$  to  $s - 1$  do
4     $sum \leftarrow sum + K[i]$ ;
5  return  $abs(sum) \% m$ ; //  $abs = \text{overflow and } \%$ 

```

Fair/bad distribution depending on m and K

- Suppose that $\text{length}(K) = 10$ (in average)
- Let K have only capital letters
- Since $A = 65$ and $Z = 90$, $sum \in [650..900]$
- If $m \leq 100$, it is a **fair** distribution
- If $m \geq 1000$, it is a **bad** distribution



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Hash functions for strings

A better approach: **sfold**:

Algorithm: `int h(string K)`

```

1  intLength  $\leftarrow$  length(K)/4;
2  sum  $\leftarrow$  0;
3  for i  $\leftarrow$  0 to intLength - 1 do
4      sub  $\leftarrow$  substring(K, i * 4, (i * 4) + 4);    // initial and final positions
5      mult  $\leftarrow$  1;
6      for j  $\leftarrow$  0 to 3 do
7          sum  $\leftarrow$  sum + sub[j] * mult;
8          mult  $\leftarrow$  mult * 256;

9  sub  $\leftarrow$  substring(K, intLength * 4);            // initial position to the end
10 mult  $\leftarrow$  1;
11 s  $\leftarrow$  length(sub);
12 for j  $\leftarrow$  0 to s - 1 do
13     sum  $\leftarrow$  sum + sub[j] * mult;
14     mult  $\leftarrow$  mult * 256;

15 return abs(sum)%m; // abs = overflow and %

```



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

1   $\text{intLength} \leftarrow \text{length}(K)/4;$ 
2   $\text{sum} \leftarrow 0;$ 
3  for  $i \leftarrow 0$  to  $\text{intLength} - 1$  do
4       $\text{sub} \leftarrow \text{substring}(K, i * 4, (i * 4) + 4);$ 
5       $\text{mult} \leftarrow 1;$ 
6      for  $j \leftarrow 0$  to  $3$  do
7           $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult};$ 
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9   $\text{sub} \leftarrow \text{substring}(K, \text{intLength} * 4);$ 
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13      $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult};$ 
14      $\text{mult} \leftarrow \text{mult} * 256;$ 
15 return  $\text{abs}(\text{sum}) \% m;$ 

```

Let $K = \text{"ALGORITHMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

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8          mult  $\leftarrow \text{mult} * 256$ ;
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14     mult  $\leftarrow \text{mult} * 256$ ;
15 return  $\text{abs}(\text{sum}) \% m$ ;

```

Let $K = \text{"ALGORITHMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$\text{sum} = 0$



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Hash functions for strings

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15 return  $\text{abs}(\text{sum}) \% m;$ 
```

Let $K = \text{"ALGORITHMMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$i = 0$

$\text{sub} = \text{"ALGO"}$

$\text{sum} = 1330072641$

$\text{mult} = 0$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

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15 return  $\text{abs}(\text{sum}) \% m;$ 
```

Let $K = \text{"ALGORITHMMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$i = 1$

$\text{sub} = \text{"RITH"}$

$\text{sum} = -1751411309$

$\text{mult} = 0$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

1   $\text{intLength} \leftarrow \text{length}(K)/4;$ 
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10  $\text{mult} \leftarrow 1;$ 
11  $s \leftarrow \text{length}(\text{sub});$ 
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13      $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult};$ 
14      $\text{mult} \leftarrow \text{mult} * 256;$ 
15 return  $\text{abs}(\text{sum}) \% m;$ 
```

Let $K = \text{"ALGORITHMMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$i = 2$

$\text{sub} = \text{"RITH"}$

$\text{sum} = -1751411309$

$\text{mult} = 0$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

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3  for  $i \leftarrow 0$  to  $\text{intLength} - 1$  do
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11  $s \leftarrow \text{length}(\text{sub})$ ;
12 for  $j \leftarrow 0$  to  $s - 1$  do
13      $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult}$ ;
14      $\text{mult} \leftarrow \text{mult} * 256$ ;
15 return  $\text{abs}(\text{sum}) \% m$ ;

```

Let $K = \text{"ALGORITHMMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$\text{sub} = \text{"MS"}$

$s = 2$

$\text{sum} = -1751411309$

$\text{mult} = 1$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

1   $\text{intLength} \leftarrow \text{length}(K)/4$ ;
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12 for  $j \leftarrow 0$  to  $s - 1$  do
13      $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult}$ ;
14      $\text{mult} \leftarrow \text{mult} * 256$ ;
15 return  $\text{abs}(\text{sum}) \% m$ ;

```

Let $K = \text{"ALGORITHMMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$\text{sub} = \text{"MS"}$

$s = 2$

$j = 0$

$\text{sum} = -1751411232$

$\text{mult} = 256$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

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13      $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult}$ ;
14      $\text{mult} \leftarrow \text{mult} * 256$ ;
15 return  $\text{abs}(\text{sum}) \% m$ ;

```

Let $K = \text{"ALGORITHMMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$\text{sub} = \text{"MS"}$

$s = 2$

$j = 1$

$\text{sum} = -1751389984$

$\text{mult} = 65536$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

1   $\text{intLength} \leftarrow \text{length}(K)/4$ ;
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3  for  $i \leftarrow 0$  to  $\text{intLength} - 1$  do
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12 for  $j \leftarrow 0$  to  $s - 1$  do
13      $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult}$ ;
14      $\text{mult} \leftarrow \text{mult} * 256$ ;
15 return  $\text{abs}(\text{sum}) \% m$ ;

```

Let $K = \text{"ALGORITHMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = ?$

$\text{intLength} = 2$

$\text{sub} = \text{"MS"}$

$s = 2$

$j = 2$

$\text{sum} = -1751389984$

$\text{mult} = 65536$



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Hash functions for strings

Algorithm: $\text{int } h(\text{string } K)$

```

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10  $\text{mult} \leftarrow 1$ ;
11  $s \leftarrow \text{length}(\text{sub})$ ;
12 for  $j \leftarrow 0$  to  $s - 1$  do
13      $\text{sum} \leftarrow \text{sum} + \text{sub}[j] * \text{mult}$ ;
14      $\text{mult} \leftarrow \text{mult} * 256$ ;
15 return  $\text{abs}(\text{sum}) \% m$ ;

```

Let $K = \text{"ALGORITHMS"}$

Let $m = 1000$

$\text{fold}(K) = 762$

$\text{sfold}(K) = 984$



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Hashing: collisions

Collisions

- If $m < |Key|$, they **will** occur
- If $m \geq |Key|$, they still **might** occur

Collision resolution mechanisms

- **Open** hashing (separate chaining)
- **Closed** hashing (open addressing)

Perfect hashing

- No collisions at all
- Key is known and available beforehand
- Example: data access on a read-only CD



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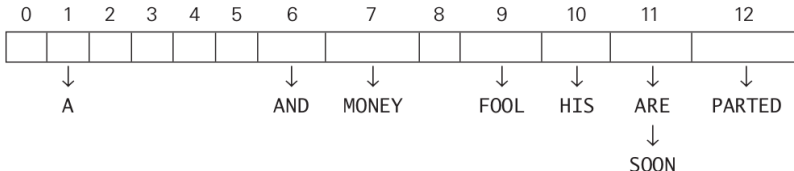
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Open hashing³

Each **hash address** is associated with a **linked list**

Example (considering $A = 1$ and **fold**):

keys	A	FOOL	AND	HIS	MONEY	ARE	SOON	PARTED
hash addresses	1	9	6	10	7	11	11	12



³Source: A. Levitin. Introduction to the Design and Analysis of Algorithms. 2011.



Open hashing

Insertion:

- 1 Compute $h(K) = j$
- 2 Insert in the j -th linked list
 - Sorted list: **better** search, **worse** insertion
 - Unsorted: **worse** search, **better** insertion

Search:

- 1 Compute $h(K) = j$
- 2 If the j -th linked list is empty, element not found
- 3 Otherwise, search the linked list

Deletion:

- Compute $h(K) = j$
- Remove from the j -th linked list



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Dictionary ADT implemented using open hashing

Composite type (Dictionary):

```

1  int m;                                // size of the hash table
2  int cnt;                             // number of elements in the dictionary
3  List[] H;                           // hash table as an array of lists
4  h : Key  $\rightarrow$  0..m - 1;              // hash function

```

Algorithm: Dictionary create_dict(int size, *h* : Key \rightarrow 0..*m*-1)

```

1  d.m  $\leftarrow$  size ; d.cnt  $\leftarrow$  0;
2  d.H  $\leftarrow$  new List[size];
3  for i  $\leftarrow$  0 to size - 1 do
    // a list of Entry, which combines Key and E
4  [ d.H[i]  $\leftarrow$  create_list();
5  d.h  $\leftarrow$  h;
6  return d;

```



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Dictionary ADT implemented using open hashing

Some assumptions

- The lists are not sorted (always inserting in the end)
- If there is an entry in d with key k , nothing is done

Algorithm: void insert(Dictionary d , Key k , E e)

```

1  if find( $d, k$ ) = NULL then
2       $pos \leftarrow d.h(k);$            //  $h$  is the hash function
3       $l \leftarrow d.H[pos];$          //  $H$  is the hash table
4       $entry \leftarrow create\_entry(k, e);$ 
5       $append(l, entry);$ 

```



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Open hashing: temporal efficiency

Insertion (unsorted): $\Theta(1)$

Search: depends on the **load factor** $\alpha = \frac{n}{m}$

- $S \approx 1 + \frac{\alpha}{2}$ and $U = \alpha$, where
 S = succesful, U = unsuccessful,
 n = number of elements in the hash table
- When $\alpha \approx 1$, then in $\Theta(1)$ (in average)

Deletion: similar to the temporal efficiency of searching



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Closed hashing

All **elements** are **stored in the hash table itself** (requirement: $m \geq n$)

Strategies for defining an **offset** in the presence of collisions:

- **Linear** probing
- **Pseudo-random** probing
- **Quadratic** probing
- **Double** hashing

The strategy should ensure that **every hash address** can be **reached** when solving a collision



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Closed hashing: linear probing⁴

Insertion: check the cell following the one where the collision occurs

- **Probe function (offset):** $p(K, i) = i$
- Hash table is seen as a circular array
- Example (considering $A = 1$ and **fold**):

keys	A	FOOL	AND	HIS	MONEY	ARE	SOON	PARTED
hash addresses	1	9	6	10	7	11	11	12

	0	1	2	3	4	5	6	7	8	9	10	11	12
	A												
	A									FOOL			
	A					AND				FOOL			
	A					AND				FOOL	HIS		
	A					AND	MONEY			FOOL	HIS		
	A					AND	MONEY			FOOL	HIS	ARE	
	A					AND	MONEY			FOOL	HIS	ARE	SOON
PARTED	A					AND	MONEY			FOOL	HIS	ARE	SOON



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⁴Source: A. Levitin. Introduction to the Design and Analysis of Algorithms. 2011.

Closed hashing: linear probing

Search:

- 1 Compute $h(K) = j$
- 2 If $H[j]$ is empty, element not found
- 3 If $H[j] = K$, element found
- 4 Otherwise, check the following position (go back to step 2)
 - Attention to a hash table where $m = n$

Example (considering $A = 1$ and **fold**):

- $h(\text{"LIT"}) = 2$, as $H[2]$ is empty, "LIT" is not in the table
- $h(\text{"KID'}) = 11$, search finishes just after comparing K with "ARE", "SOON", "PARTED", and "A"



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Closed hashing: linear probing

Deletion: need to use a special symbol

- Update **insertion** and **search** to consider this symbol

Analysis of temporal efficiency is more complicated:

- $S \approx \frac{1}{2}(1 + \frac{1}{1-\alpha})$
- $U \approx \frac{1}{2}(1 + \frac{1}{(1-\alpha)^2})$



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Closed hashing: linear probing⁵

Evolution of S and U based on α

α	$\frac{1}{2}(1 + \frac{1}{1-\alpha})$	$\frac{1}{2}(1 + \frac{1}{(1-\alpha)^2})$
50%	1.5	2.5
75%	2.5	8.5
90%	5.5	50.5

When $\alpha \approx 1$, linear probing deteriorates (**primary clustering**)

- Higher probability of adding an element to a cluster
- Higher probability of coalescing two clusters

⁵Source: A. Levitin. Introduction to the Design and Analysis of Algorithms. 2011.

Closed hashing: pseudo-random probing

Pseudo-random probing:

$p(K, i) = \text{Perm}[i - 1]$,

where *Perm* is a permutation of $1..m - 1$

Example ($m = 8$)

- $h(k) = k - (8 * \lfloor k/8 \rfloor)$
- $\text{Perm} = \{2, 6, 7, 3, 1, 4, 5\}$
- Values: 2, 4, 8, 16, 32, -12

$$h(2) = 2$$

$$h(4) = 4$$

$$h(8) = 0$$

$$h(16) = 0$$

- $p(k, 1) = \text{Perm}[0] = 2$
 $(h(16) + p(k, 1)) \bmod 8 = 2$
- $p(k, 2) = \text{Perm}[1] = 6$
 $(h(16) + p(k, 2)) \bmod 8 = 6$

0	1	2	3	4	5	6	7
		2					
		2		4			
8		2		4			
8		2		4		16	



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- Values: 2, 4, 8, 16, 32, -12

$$h(32) = 0$$

- $p(k, 1) = \text{Perm}[0] = 2$
 $(h(32) + p(k, 1)) \bmod 8 = 2$
- $p(k, 2) = \text{Perm}[1] = 6$
 $(h(32) + p(k, 2)) \bmod 8 = 6$
- $p(k, 3) = \text{Perm}[2] = 7$
 $(h(32) + p(k, 3)) \bmod 8 = 7$

0	1	2	3	4	5	6	7
8		2		4		16	32



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Closed hashing: pseudo-random probing

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$$p(K, i) = \text{Perm}[i - 1],$$

where Perm is a permutation of $1..m - 1$

Example ($m = 8$)

- $h(k) = k - (8 * \lfloor k/8 \rfloor)$
- $\text{Perm} = \{2, 6, 7, 3, 1, 4, 5\}$
- Values: 2, 4, 8, 16, 32, -12

$$h(-12) = 4$$

- $p(k, 1) = \text{Perm}[0] = 2$
 $(h(-12) + p(k, 1)) \bmod 8 = 6$
- $p(k, 2) = \text{Perm}[1] = 6$
 $(h(-12) + p(k, 2)) \bmod 8 = 2$
- $p(k, 3) = \text{Perm}[2] = 7$
 $(h(-12) + p(k, 3)) \bmod 8 = 3$

0	1	2	3	4	5	6	7
8		2	-12	4		16	32



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Closed hashing: pseudo-random probing

Pseudo-random probing:

$$p(K, i) = \text{Perm}[i - 1],$$

where *Perm* is a permutation of $1..m - 1$

Example ($m = 8$)

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- $\text{Perm} = \{2, 6, 7, 3, 1, 4, 5\}$
- Values: 2, 4, 8, 16

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$$h(4) = 4$$

$$h(8) = 0$$

$$h(16) = 0$$

- $p(k, 1) = \text{Perm}[0] = 2$
 $(h(16) + p(k, 1)) \bmod 8 = 2$
- $p(k, 2) = \text{Perm}[1] = 6$
 $(h(16) + p(k, 2)) \bmod 8 = 6$

0	1	2	3	4	5	6	7
8		2		4		16	



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Dictionary ADT implemented using closed hashing

Composite type (Dictionary):

```

1  int m;                                // size of the hash table
2  int cnt;                             // number of elements in the dictionary
3  Entry[] H;                           // hash table as an array of Entry
4  int[] Perm;                           // permutation of 1..m-1
5  h : Key → 0..m - 1;                 // hash function

```

Algorithm: Dictionary create_dict(int size, *h* : Key → 0..*size*-1)

```

1  d.m ← size ; d.cnt ← 0;
2  d.H ← new Entry[size];
3  d.Perm ← create_permutation(1..size - 1);
4  d.h ← h;
5  return d;

```



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Dictionary ADT implemented using closed hashing

Some assumptions

- d is implemented as a hash table with m positions
- If there is an entry in d with key k , nothing is done

Algorithm: void insert(Dictionary d , Key k , E e)

```

1  if size( $d$ ) <  $d.m \wedge$  find( $d, k$ ) = NULL then
2      pos  $\leftarrow d.h(k)$ ;                                //  $h$  is the hash function
3      if  $d.H[pos] \neq$  NULL  $\wedge$   $d.H[pos] \neq$  deleted then
4          i  $\leftarrow$  0;
5          repeat
6              i  $\leftarrow$  i + 1;
7              offset  $\leftarrow d.Perm[i - 1]$ ;
8              newPos  $\leftarrow (pos + offset) \% d.m$ ;
9              until  $d.H[newPos] =$  NULL  $\vee$   $d.H[newPos] =$  deleted;
10         pos  $\leftarrow$  newPos;
11     entry  $\leftarrow$  create_entry( $k, e$ );
12      $d.H[pos] \leftarrow$  entry;
13      $d.cnt \leftarrow d.cnt + 1$ ;

```



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Closed hashing: quadratic probing

Quadratic probing:

$$p(K, i) = c_1 i^2 + c_2 i + c_3$$

$$h(2) = 2$$

$$h(4) = 4$$

$$h(8) = 0$$

Example ($m = 8$):

- $h(k) = k - (8 * \lfloor k/8 \rfloor)$
- $p(k, i) = \frac{i^2 + i}{2}$:
- Values: 2, 4, 8, 16, 32, -12

0	1	2	3	4	5	6	7
		2					
		2		4			
8		2		4			



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Closed hashing: quadratic probing

Quadratic probing:

$$p(K, i) = c_1 i^2 + c_2 i + c_3$$

Example ($m = 8$):

- $h(k) = k - (8 * \lfloor k/8 \rfloor)$
- $p(k, i) = \frac{i^2 + i}{2}$:
- Values: 2, 4, 8, 16, 32, e -12

0	1	2	3	4	5	6	7
8	16	2		4			
8	16	2	32	4			
8	16	2	32	4	-12		

$$h(16) = 0$$

$$\begin{aligned} \blacksquare p(k, 1) &= \frac{1^2 + 1}{2} = 1 \\ (h(16) + p(k, 1)) \bmod 8 &= 1 \end{aligned}$$

$$h(32) = 0$$

$$\begin{aligned} \blacksquare p(k, 1) &= \frac{1^2 + 1}{2} = 1 \\ (h(32) + p(k, 1)) \bmod 8 &= 1 \end{aligned}$$

$$\begin{aligned} \blacksquare p(k, 2) &= \frac{2^2 + 2}{2} = 3 \\ (h(32) + p(k, 2)) \bmod 8 &= 3 \end{aligned}$$

$$h(-12) = 4$$

$$\begin{aligned} \blacksquare p(k, 1) &= \frac{1^2 + 1}{2} = 1 \\ (h(-12) + p(k, 1)) \bmod 8 &= 5 \end{aligned}$$

Closed hashing: pseudo-random | quadratic probing

We might still have **secondary clustering**

- If $h(k_1) = h(k_2)$, then k_1 and k_2 share the same **probe sequence**
- Rationale: p ignores the value of K

Alternative: **double hashing**



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Closed hashing: double hashing

A **new hash function** $s(K)$ is used to determine the probe sequence

- $p(K, i) = i * s(K)$

Temporal efficiency

- Also deteriorates when $\alpha \approx 1$
- Alternative: **resize** the hash table and perform **rehashing**



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Agenda

- 1 Dictionaries
- 2 Hash tables
- 3 Open hashing
- 4 Closed hashing
- 5 Bibliography**

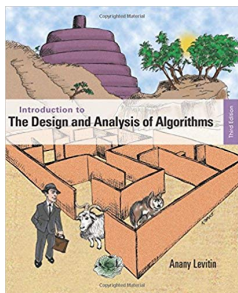


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HASH TABLES

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