

# Searching

Dr. Nguyen Hua Phung

HCMC University of Technology, Viet Nam

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  - Searching Unsorted Arrays
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## Definition

- $(k_1, l_1), (k_2, l_2), \dots, (k_n, l_n)$
- Given  $K$ , locate  $(k_j, l_j)$  such that  $K == k_j$

## Terms

- Successfull search:  $\exists j, K == k_j$
- Unsuccessful search:  $\forall j, K \neq k_j$
- Exact-match query: key value exactly match searching key
- Range query: key value within a specific range

- Sequentially comparing  $K$  with  $k_j$  until  $K$  is equal to  $k_j$  or no more element.
- Best case:  $O(1)$
- Worst case:  $O(n)$

- Given sorted array  $A$  and some value  $j$ ,
- Comparing  $K$  with every  $j$ 'th element, i.e.  $A[j]$ ,  $A[2j]$ , ... until  $K$  is
  - $== A[kj] \Rightarrow$  return found
  - $> A[kj] \Rightarrow$  linear search from  $A[(k-1)j]$  to  $A[kj]$
  - no more element  $\Rightarrow$  linear search from  $A[(k-1)j]$  to  $A[n]$
- If  $j$  is  $\sqrt{n}$ , worst case cost  $\approx 2\sqrt{n}$ .

- Given an array  $A$  in ascending order,
- Comparing  $K$  with the element at the middle  $A[n/2]$ , if  $K$  is
  - $= A[n/2] \Rightarrow$  return found
  - $< A[n/2] \Rightarrow$  recursively search on the left half of  $A$
  - $> A[n/2] \Rightarrow$  recursively search on the right half of  $A$
- Worst case:  $O(\log_2 n)$

- Given a sorted array  $A$ ,
- Assume the values in  $A$  are **evenly** distributed,
- Like binary search but comparing with the element at

$$p = \frac{K - A[1]}{A[n] - A[1]} \times n$$

- In many search applications, real access patterns follow the rule: *80/20*
- 80% access to 20% of data
- Arrange the array based on the **frequency of access** instead of the value of element
  - Sort the array based on the frequency
  - Move-to-front the element when it is found
  - Transpose: move the element one step toward the front when it is found
- Sequential search



## Example of frequency Sorting

- Keep the array sorted by frequency
- Search F
- Search D
- Search D

0	0	0	0	0	0	0	0
A	B	C	D	E	F	G	H

## Example of frequency Sorting

- Keep the array sorted by frequency
- Search F
- Search D
- Search D

0	0	0	0	0	1	0	0
A	B	C	D	E	F	G	H

## Example of frequency Sorting

- Keep the array sorted by frequency
- Search F
- Search D
- Search D

1	0	0	0	0	0	0	0
F	A	B	C	D	E	G	H

## Example of frequency Sorting

- Keep the array sorted by frequency
- Search F
- Search D
- Search D

1	0	0	0	1	0	0	0
F	A	B	C	D	E	G	H

## Example of frequency Sorting

- Keep the array sorted by frequency
- Search F
- Search D
- Search D

1	1	0	0	0	0	0	0
F	D	A	B	C	E	G	H

## Example of frequency Sorting

- Keep the array sorted by frequency
- Search F
- Search D
- Search D

1	2	0	0	0	0	0	0
F	D	A	B	C	E	G	H

## Example of frequency Sorting

- Keep the array sorted by frequency
- Search F
- Search D
- Search D

2	1	0	0	0	0	0	0
D	F	A	B	C	E	G	H

## Example of Move\_to\_front

- Apply move\_to\_front
- Search F
- Search D
- Search D

A	B	C	D	E	F	G	H
---	---	---	---	---	---	---	---



## Example of Move\_to\_front

- Apply move\_to\_front
- Search F
- Search D
- Search D

A	B	C	D	E	F	G	H
---	---	---	---	---	---	---	---

## Example of Move\_to\_front

- Apply move\_to\_front
- Search F
- Search D
- Search D

F	A	B	C	D	E	G	H
---	---	---	---	---	---	---	---

## Example of Move\_to\_front

- Apply move\_to\_front
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- Search D
- Search D

F	A	B	C	D	E	G	H
---	---	---	---	---	---	---	---

## Example of Move\_to\_front

- Apply move\_to\_front
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- Search D
- Search D

D	F	A	B	C	E	G	H
---	---	---	---	---	---	---	---

## Example of Move\_to\_front

- Apply move\_to\_front
- Search F
- Search D
- Search D

D	F	A	B	C	E	G	H
---	---	---	---	---	---	---	---

## Example of Transpose

- Apply transpose
- Search F
- Search D
- Search D

A	B	C	D	E	F	G	H
---	---	---	---	---	---	---	---

# Example of Transpose

- Apply transpose
- Search F
- Search D
- Search D

A	B	C	D	E	F	G	H
---	---	---	---	---	---	---	---

## Example of Transpose

- Apply transpose
- Search F
- Search D
- Search D

A	B	C	D	F	E	G	H
---	---	---	---	---	---	---	---



## Example of Transpose

- Apply transpose
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- Search D
- Search D

A	B	C	D	F	E	G	H
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- Apply transpose
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## Example of Transpose

- Apply transpose
- Search F
- Search D
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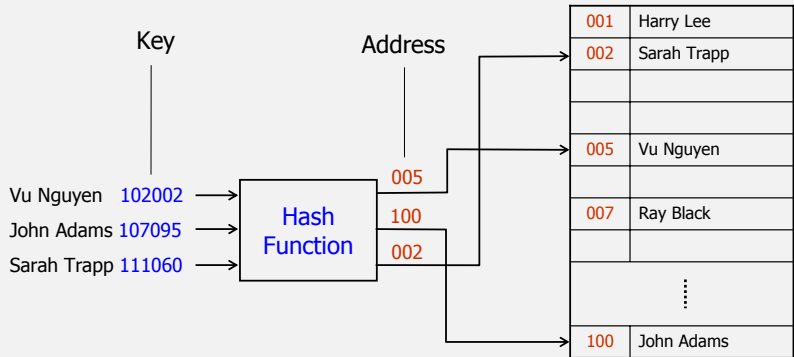
A	D	B	C	F	E	G	H
---	---	---	---	---	---	---	---

- Sequential Search:  $O(n)$
  - Binary Search:  $O(\log n)$
- } requiring several **key comparisons** before the target is found
- Is there a search algorithm whose complexity is  $O(1)$ ?  
**YES**
    - Use key as the array index
    - Good on time complexity but bad on space complexity
    - Use a function to map from big space to smaller space:  
hashing function

# Example

0	1	2	3	4		120	121	122		1023
		2					121			1023

# Hash Function Example

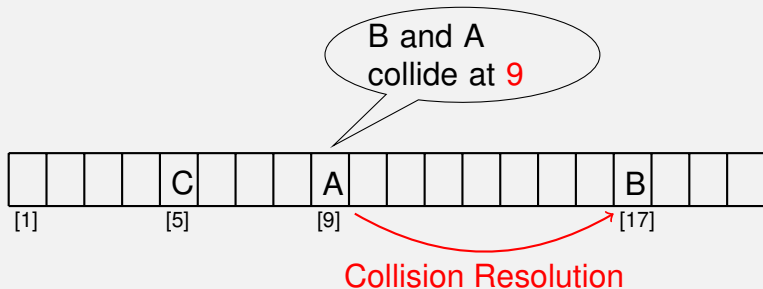


- Home address: address produced by a hash function
- Prime area: memory that contains all the home address
- Synonyms: a set of keys that hash to the same location
- Collision: the location of the data to be inserted is already occupied by other data.
- Probing: the technique to resolve the collisions.
- Ideal hashing:
  - No location collision
  - Compact address space



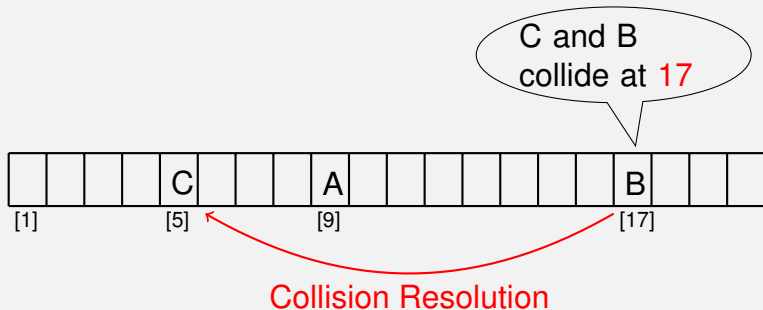
# Basic Concepts

- Insert A, B, C
- $\text{hash}(A) = 9$
- $\text{hash}(B) = 9$
- $\text{hash}(C) = 17$



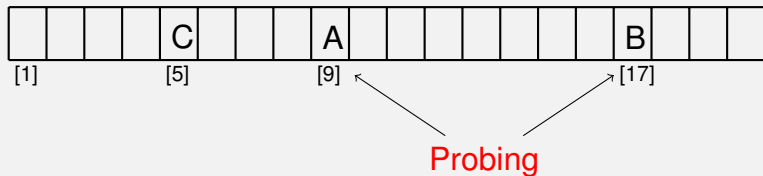
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# Basic Concepts

- Insert A, B, C
- $\text{hash}(A) = 9$
- $\text{hash}(B) = 9$
- $\text{hash}(C) = 17$



- Direct hashing
- Modulo division
- Digit extraction
- Mid-square
- Folding
- Rotation
- Pseudo-random

- The address is the key itself
$$\text{hash}(\text{Key}) = \text{Key}$$
- Advantage: there is no collision.
- Disadvantage: the address space (storage size) is as large as the key space

$$\text{Address} = \text{Key} \text{ MOD } \text{listSize} + 1$$

- Fewer collisions if listSize is a prime number
- Example:
  - Numbering system to handle 1,000,000 employees
  - Data space to store up to 300 employees
  - $\text{hash}(121267) = 121267 \text{ MOD } 307 + 1 = 2 + 1 = 3$

Address = selected digits from **Key**

- Example:

379452 → 394

121267 → 112

378845 → 388

160252 → 102

045128 → 051

Address = middle digits of  $\text{Key}^2$

- Example:

$$9452 * 9452 = 89340304 \rightarrow 3403$$

- Disadvantage: the size of the  $\text{Key}^2$  is too large
- Variations: use only a portion of the key

$$379452 : 379 * 379 = 143641 \rightarrow 364$$

$$121267 : 121 * 121 = 014641 \rightarrow 464$$

$$045128 : 045 * 045 = 002025 \rightarrow 202$$



- The key is divided into parts whose size matches the address size
- Example:

Key = 123456789

Folding: 123|456|789

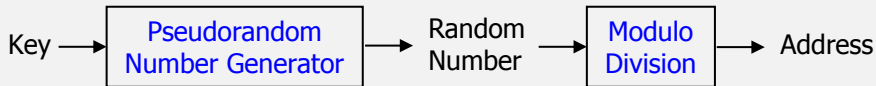
Fold shift:  $123 + 456 + 789 = 1368 \Rightarrow 368$

or

Fold boundary:  $321 + 456 + 987 = 1764 \Rightarrow 764$

- Hashing keys that are identical except for the last character may create synonyms.
- The key is rotated before hashing.
- Used in combination with fold shift
- Spreading the data more evenly across the address space

<u>original key</u>	<u>rotated key</u>	<u>fold shift</u>
600101	160010	16
600102	260010	26
600103	360010	36
600104	460010	46
600105	560010	56



$$y = ax + c$$

- For maximum efficiency, **a** and **c** should be prime numbers
- Example:

Key = 121267      a = 17      c = 7      listSize = 307

$$\begin{aligned}\text{Address} &= ((17 * 121267 + 7) \text{ MOD } 307 + 1) \\ &= (2061539 + 7) \text{ MOD } 307 + 1 \\ &= 2061546 \text{ MOD } 307 + 1 \\ &= 41 + 1 \\ &= 42\end{aligned}$$

- Except for the direct hashing, none of the others are **one-to-one mapping**  
⇒ Requiring collision resolution methods
- Each collision resolution method can be used **independently** with each hash function
- A rule of thumb: a hashed list should not be allowed to become more than **75%** full.
- Load factor:

$$\alpha = (k/n) * 100$$

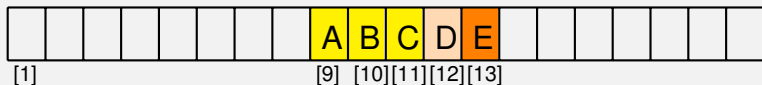
**n** = list size

**k** = number of filled elements

- As data are added and collisions are resolved, hashing tends to cause data to group within the list  
⇒ **Clustering**: data are unevenly distributed across the list
- High degree of clustering increases the **number of probes** to locate an element  
⇒ **Minimize** clustering

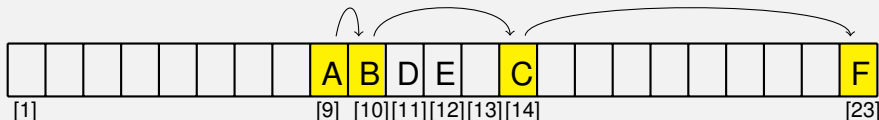
- **Primary clustering:** data become clustered around a home address.

Insert  $A_9$ ,  $B_9$ ,  $C_9$ ,  $D_{11}$ ,  $E_{12}$



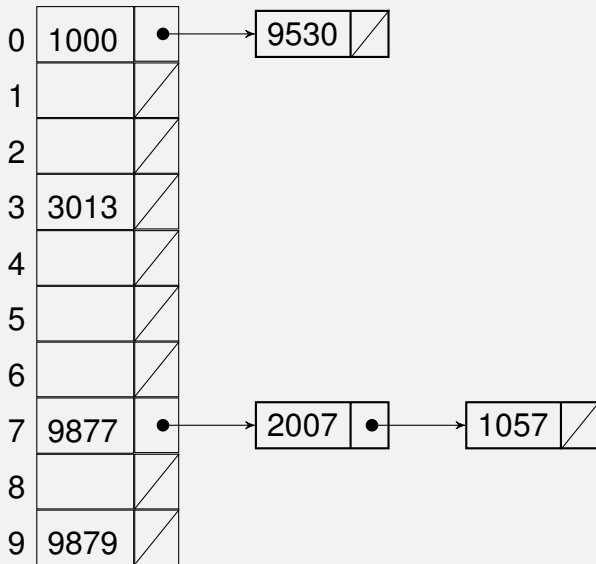
- **Secondary clustering:** data become grouped along a collision path throughout a list.

Insert  $A_9$ ,  $B_9$ ,  $C_9$ ,  $D_{11}$ ,  $E_{12}$ ,  $F_9$



- Open hashing
- Closed hashing
  - Bucket hashing
  - Open Addressing
    - Linear probing
    - Quadratic probing
    - Double hashing

Use **linked list** to store synonyms





- Hashing data to **buckets** that can hold multiple pieces of data.
- Each bucket has an address and **collisions are postponed** until the bucket is full.

# Bucket Hashing Example

- Hash function:  $h(k) = k \text{ MOD } 5$
- Insert in the order: 9877, 2007, 1000, 9530, 3013, 9879, and 1057

Hash table		Overflow
0	1000	1057
	9530	
1		
2	9877	
	2007	
3	3013	
4	9879	

- When a collision occurs, an **unoccupied element** is searched for placing the new element in.
- Normal hash function:

$$\begin{array}{ccc} h: U & \rightarrow & \{0, \dots, m-1\} \\ | & & | \\ \text{set of keys} & & \text{addresses} \end{array}$$

- **Open Addressing** uses hash and probe function:

$$\begin{array}{ccccc} h: U & \times & \{0, 1, \dots, m-1\} & \rightarrow & \{0, \dots, m-1\} \\ | & & | & & | \\ \text{set of keys} & & \text{probe numbers} & & \text{addresses} \end{array}$$

- There are different methods:
  - Linear probing
  - Quadratic probing
  - Double hashing

- When a home address is occupied, go to the **next address** (the current address + 1):

$$hp(k,i) = (h(k) + i) \text{ MOD } m$$

- **Advantages:**
  - quite simple to implement
  - data tend to remain near their home address (significant for disk addresses)
- **Disadvantages:**
  - produces primary clustering

# Linear Probing Example

- Hash function:  $h(k) = k \text{ MOD } 10$
- $hp(k,i) = (h(k) + i) \text{ MOD } 10$
- Insert **1001**, **9050**, **9877**, **2037** and **1059**

0	9050
1	1001
2	
3	
4	
5	
6	
7	9877
8	2037
9	1059

- The address increment is the collision probe number squared:

$$hp(k,i) = (h(k) + i^2) \text{ MOD } m$$

- **Advantages:**
  - works much better than linear probing
- **Disadvantages:**
  - time required to square numbers
  - produces secondary clustering

# Quadratic Probing Example

- Hash function:  $A_9, B_9, C_9, D_{11}, E_{12}, F_9$
- $hp(k,i) = (h(k) + i^2) \text{ MOD } 23 + 1$
- Insert A, B, C, D, E, F

									A	B		D	E	C						F				
[1]									[10]	[11]		[12]	[13]	[14]	[15]					[19]				[23]



- Using **two** hash functions:

$$hp(k,i) = (h_1(k) + i * h_2(k)) \text{ MOD } m$$

# Double Hashing Example

- Hash function 1:  $h_1(k) = k \text{ MOD } 10$
- Hash function 2:  $h_2(k) = 5 - (k \text{ MOD } 5)$
- $hp(k,i) = (h_1(k) + i * h_2(k)) \text{ MOD } 10$
- Insert **1001**, **9050**, **9877**, **2037** and **1059**
- $h_1(2037) = 7$ ,  $h_2(2037) = 3$ ,  $hp(k,1) = 0$ ,  
 $hp(k,2) = 3$

0	9050
1	1001
2	
3	2037
4	
5	
6	
7	9877
8	
9	1059