

Chapter 9: Hashing

- Basic concepts
- Hash functions
- Collision resolution
- Open addressing
- Linked list resolution
- Bucket hashing

Basic Concepts

- Sequential search: $O(n)$
- Binary search: $O(\log_2 n)$



Requiring several
key comparisons
before the target is found

Basic Concepts

- Search complexity:

Size	Binary	Sequential (Average)	Sequential (Worst Case)
16	4	8	16
50	6	25	50
256	8	128	256
1,000	10	500	1,000
10,000	14	5,000	10,000
100,000	17	50,000	100,000
1,000,000	20	500,000	1,000,000

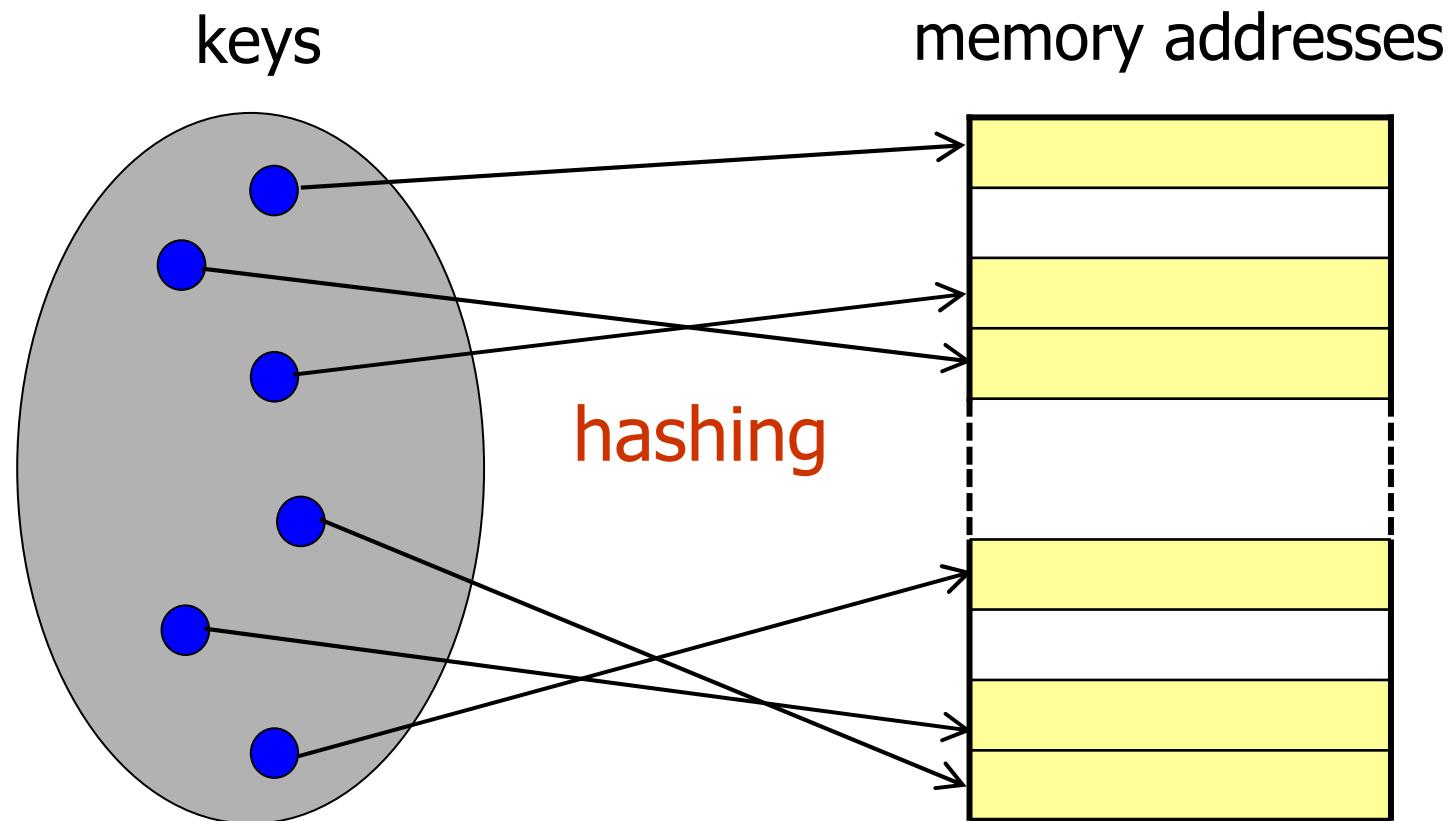
Basic Concepts

- Is there a search algorithm whose complexity is $O(1)$?

Basic Concepts

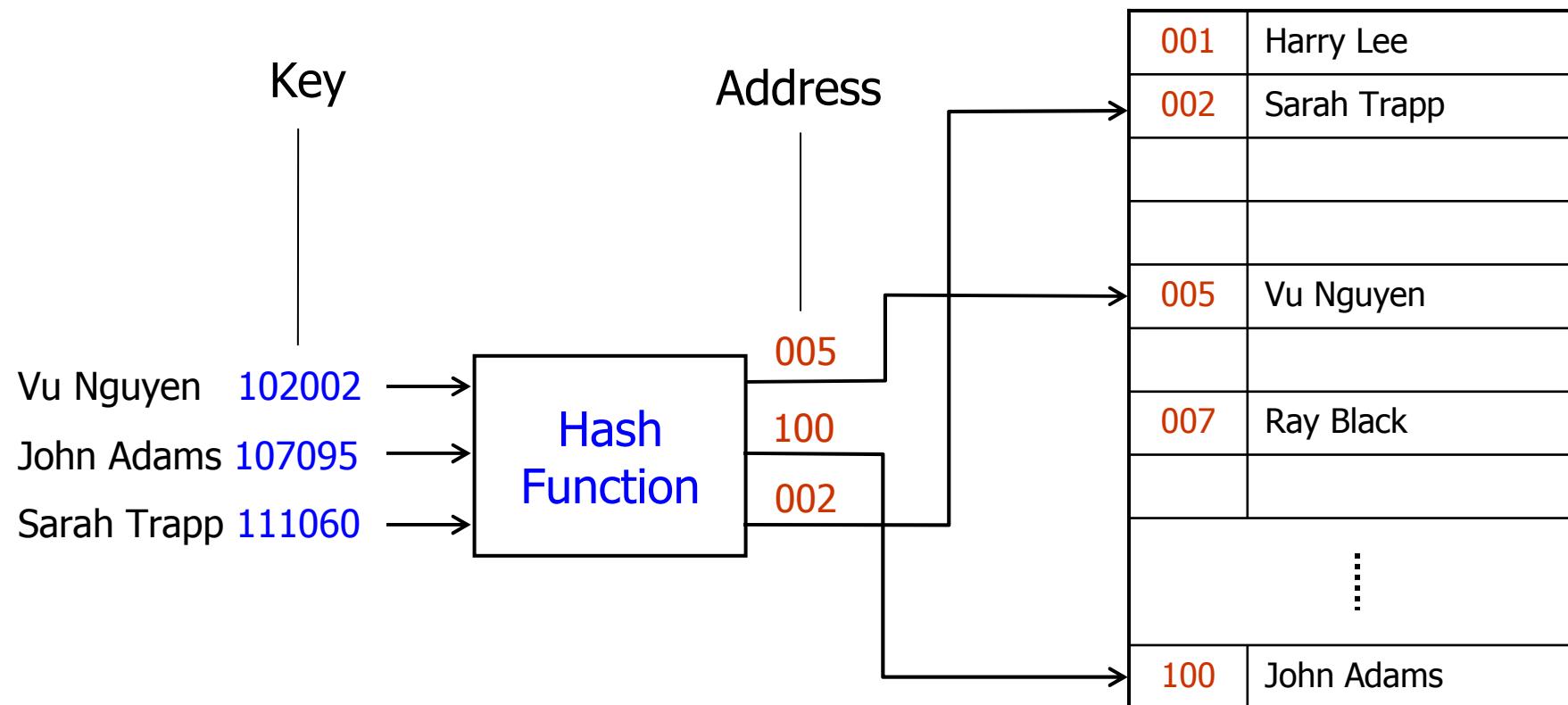
- Is there a search algorithm whose complexity is $O(1)$?
YES.

Basic Concepts



Each key has only one address

Basic Concepts



Basic Concepts

- **Home address**: address produced by a hash function.
- **Prime area**: memory that contains all the home addresses.

Basic Concepts

- **Synonyms**: a set of keys that hash to the same location.
- **Collision**: the location of the data to be inserted is already occupied by the synonym data.

Basic Concepts

- Ideal hashing:
 - No location collision
 - Compact address space

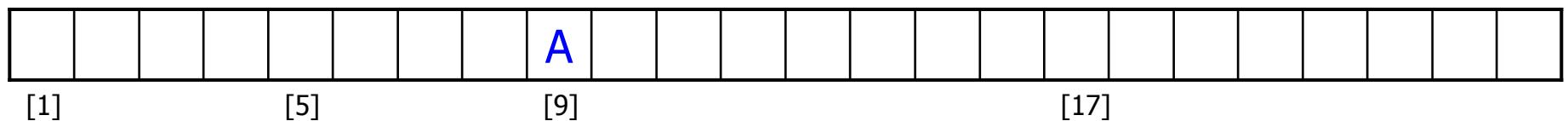
Basic Concepts

Insert A, B, C

hash(A) = 9

hash(B) = 9

hash(C) = 17



Basic Concepts

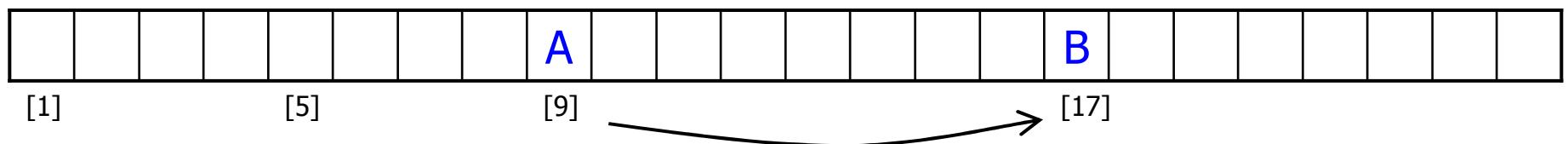
Insert A, B, C

$\text{hash}(A) = 9$

$\text{hash}(B) = 9$

$\text{hash}(C) = 17$

B and A
collide at 9



Collision Resolution

Basic Concepts

Insert A, B, C

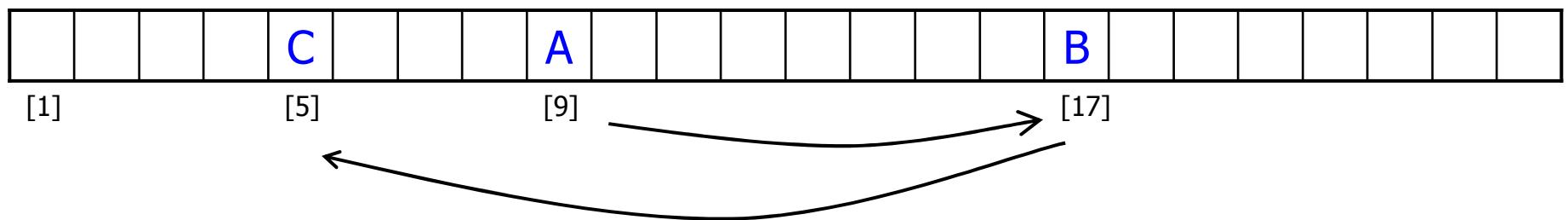
hash(A) = 9

hash(B) = 9

hash(C) = 17

B and A
collide at 9

C and B
collide at 17



Collision Resolution

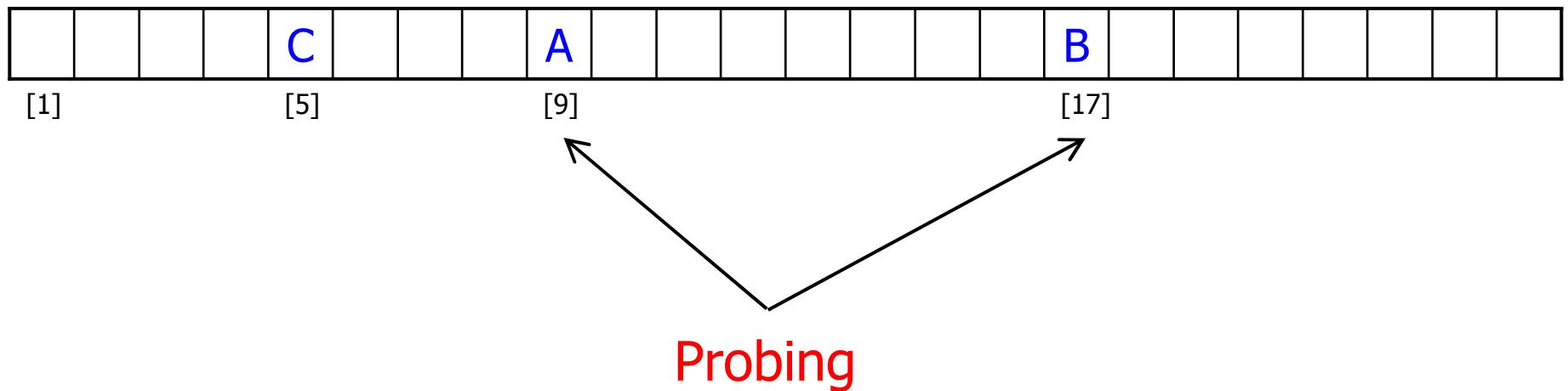
Basic Concepts

Search for B

$\text{hash}(A) = 9$

$\text{hash}(B) = 9$

$\text{hash}(C) = 17$



Hash Functions

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

Direct Hashing

- The address is the key itself:

$$\text{hash}(\text{Key}) = \text{Key}$$

Direct Hashing

- **Advantage:** there is no collision.
- **Disadvantage:** the address space (storage size) is as large as the key space

Modulo Division

Address = Key MOD 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

$$\text{hash}(121267) = 121267 \text{ MOD } 307 + 1 = 2 + 1 = 3$$

Digit Extraction

Address = selected digits from **Key**

- Example:

379452 → 394

121267 → 112

378845 → 388

160252 → 102

045128 → 051

Mid-square

Address = middle digits of **Key²**

- Example:

$$9452 * 9452 = 89\textcolor{blue}{3403}04 \rightarrow \textcolor{blue}{3403}$$

Mid-square

- **Disadvantage:** the size of the Key² is too large
- **Variations:** use only a portion of the key

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

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

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

Folding

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

Key = 123|456|789

fold shift

$$123 + 456 + 789 = 1368$$

$\Rightarrow 368$

Folding

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

Key = 123|456|789

fold shift

$$123 + 456 + 789 = 1\textcolor{blue}{368}$$
$$\Rightarrow \textcolor{blue}{368}$$

fold boundary

$$321 + 456 + 987 = 1\textcolor{blue}{764}$$
$$\Rightarrow \textcolor{blue}{764}$$

Rotation

- Hashing keys that are identical except for the last character may create synonyms.
- The key is rotated before hashing.

original key

600101

600102

600103

600104

600105

rotated key

160010

260010

360010

460010

560010

Rotation

- Used in combination with fold shift

original key

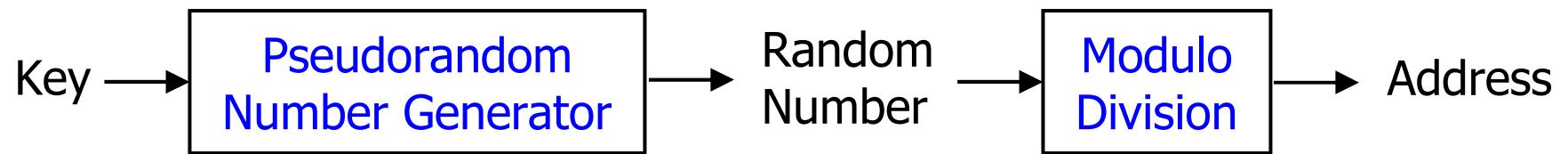
600101 → 62
600102 → 63
600103 → 64
600104 → 65
600105 → 66

rotated key

160010 → 26
260010 → 36
360010 → 46
460010 → 56
560010 → 66

Spreading the data more evenly across the address space

Pseudorandom



$$y = ax + c$$

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

Pseudorandom

- Example:

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

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

Collision Resolution

- 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

Collision Resolution

- A rule of thumb: a hashed list should not be allowed to become more than 75% full.

Load factor:

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

n = list size

k = number of filled elements

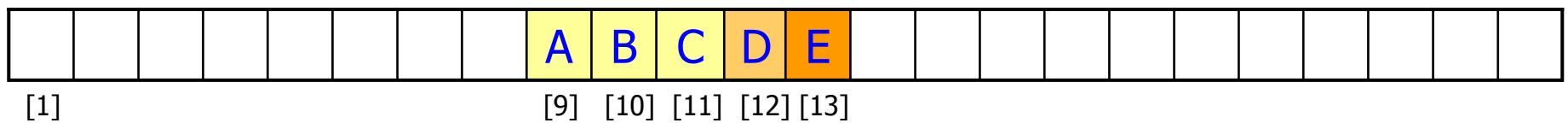
Collision Resolution

- 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

Collision Resolution

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

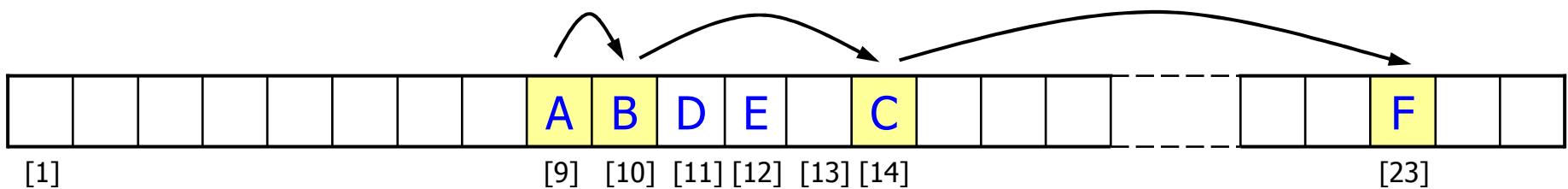
Insert A_9 , B_9 , C_9 , D_{11} , E_{12}



Collision Resolution

- **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



Collision Resolution

- Open addressing
- Linked list resolution
- Bucket hashing

Open Addressing

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

Open Addressing

- Hash function:

Open Addressing

- Hash and probe function:

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

| | |
set of keys probe numbers addresses

Open Addressing

Algorithm hashInsert (ref T <array>, val k <key>)

Inserts key k into table T

```
1  i = 0
2  loop (i < m)
    1  j = hp(k, i)
    2  if (T[j] = nil)
        1  T[j] = k
        2  return j
    3  else
        1  i = i + 1
3  return error: "hash table overflow"
End  hashInsert
```

Open Addressing

Algorithm hashSearch (val T <array>, val k <key>)

Searches for key k in table T

```
1  i = 0
2  loop (i < m)
    1  j = hp(k, i)
    2  if (T[j] = k)
        1  return j
    3  else if (T[j] = nil)
        1  return nil
    4  else
        1  i = i + 1
3  return nil
End  hashSearch
```

Open Addressing

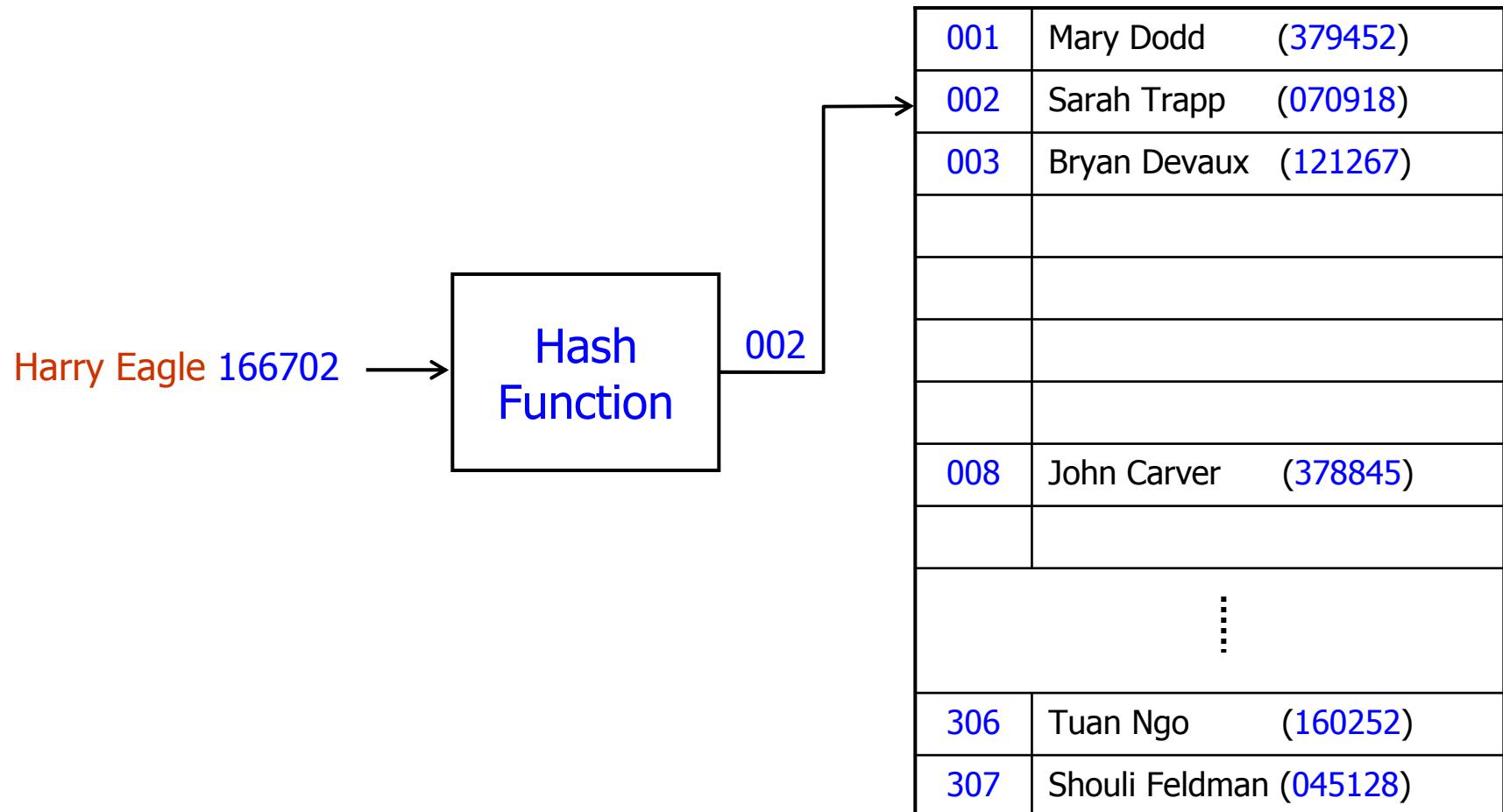
- There are different methods:
 - Linear probing
 - Quadratic probing
 - Double hashing
 - Key offset

Linear Probing

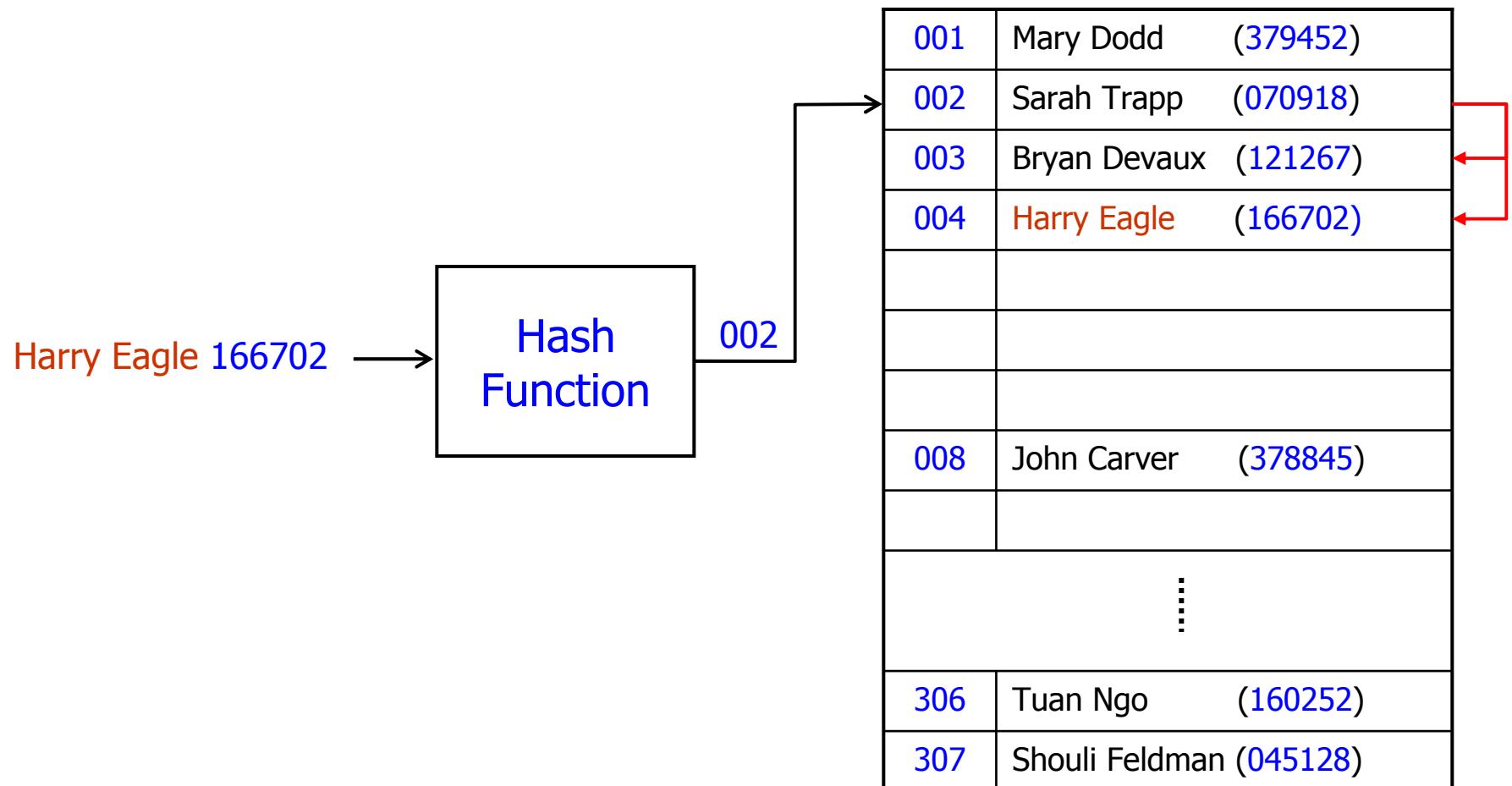
- When a home address is occupied, go to the **next address** (the current address + 1):

$$hp(k, i) = (h(k) + i) \bmod m$$

Linear Probing



Linear Probing



Linear Probing

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

Quadratic Probing

- The address increment is the collision probe number squared:

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

Quadratic Probing

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

$$h(k_1) = h(k_2) \Rightarrow hp(k_1, i) = hp(k_2, i)$$

Double Hashing

- Using two hash functions:

$$hp(k, i) = (h_1(k) + ih_2(k)) \text{ MOD } m$$

Key Offset

- The new address is a function of the **collision address** and the **key**.

offset = [**key** / **listSize**]

newAddress = (**collisionAddress** + **offset**) MOD **listSize**

Key Offset

- The new address is a function of the **collision address** and the **key**.

$$\text{offset} = [\text{key} / \text{listSize}]$$

$$\text{newAddress} = (\text{collisionAddress} + \text{offset}) \text{ MOD listSize}$$

$$hp(k, i) = (hp(k, i-1) + [k/m]) \text{ MOD } m$$

Open Addressing

- Hash and probe function:

$$\text{hp}: U \times \{0, \dots, m - 1\} \rightarrow \{0, \dots, m - 1\}$$

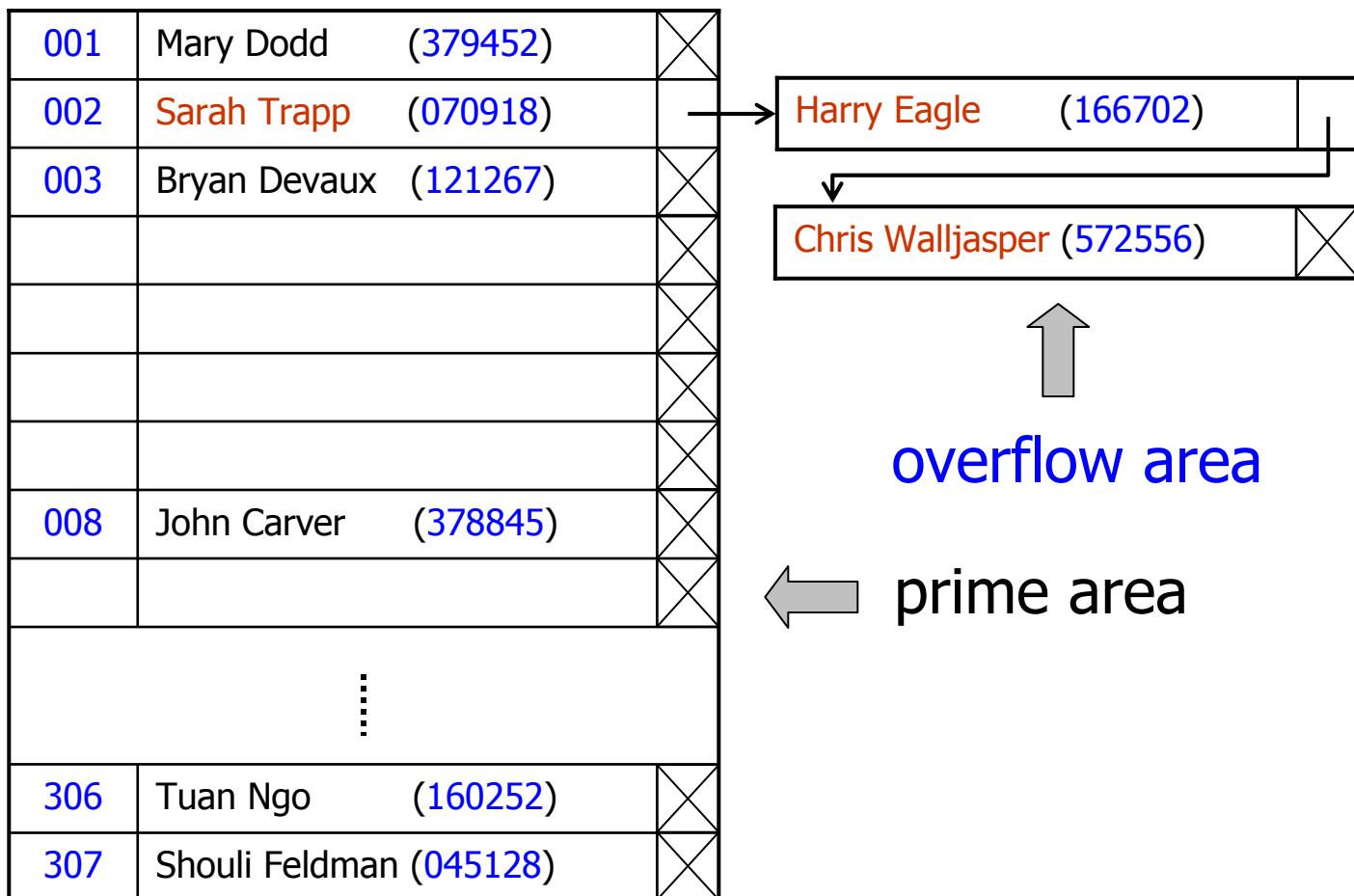
| | |
set of keys probe numbers addresses

$\langle \text{hp}(k,0), \text{hp}(k,1), \dots, \text{hp}(k,m-1) \rangle$ is a **permutation** of $\langle 0, 1, \dots, m-1 \rangle$

Linked List Resolution

- Major disadvantage of Open Addressing: each collision resolution increases the probability for future collisions.
⇒ use linked lists to store synonyms

Linked List Resolution

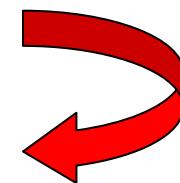


Bucket Hashing

- 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

001	Mary Dodd	(379452)
002	Sarah Trapp	(070918)
	Harry Eagle	(166702)
	Ann Georgis	(367173)
003	Bryan Devaux	(121267)
	Chris Walljasper	(572556)
⋮		
307	Shouli Feldman	(045128)



linear probing

Indexing = Hashing