Data Structures and Algorithms ¹

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¹Material for the presentation taken from Cormen, Leiserson, Rivest and Stein, *Introduction to Algorithms, Third Edition*;

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- ▶ Hash tables is a datastructure that allows us to perform SEARCH operation in O(1) time.
- Neverage time to perform any operation (INSERT, SEARCH and DELETE) should be O(1).

Satellite Data related to keys

Roll : 1023
Name : Ravi

YOB: 2000

Roll : **0912**

Name : Lata

YOB: 2000

Roll : **1756**

Name : Sagar

YOB: 1999

Roll: 1504

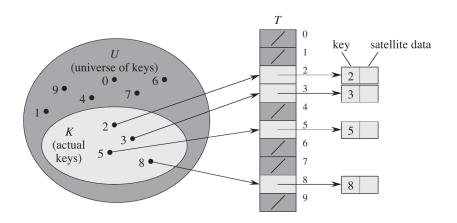
Name: Mohit

YOB: 1999

Roll : **1393**

Name: Maya

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- Works well if :
- 1. The universe U of keys is small. U = 0, 1, ..., m-1
- 2. No two elements in the dynamic set have the same key.

DIRECT-ADDRESS-SEARCH(T, k)

1 return T[k]

DIRECT-ADDRESS-INSERT (T, x)

 $1 \quad T[x.key] = x$

DIRECT-ADDRESS-DELETE (T, x)

1 T[x.key] = NIL

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 - **Each** of the operations take O(1) time.
 - What are the problems?
 - 1. *m* cannot be large.
 - 2. Two elements cannot have the same key.

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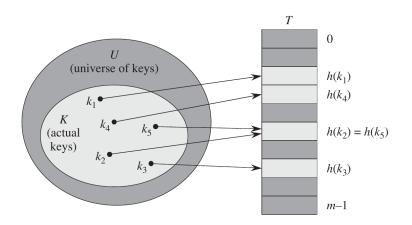
Name: Mohit

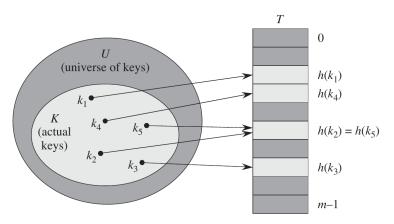
YOB: 1999

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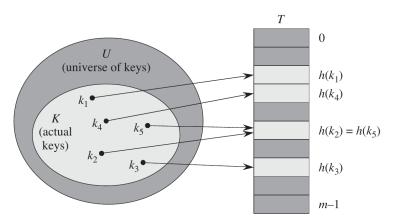
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- ▶ However, two keys can hash to the same slot (collision)

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 \blacktriangleright h(k) is called the hash value of key k

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- Storage requirements of Hash table is only $\Theta(m)$, but collisions may occur.

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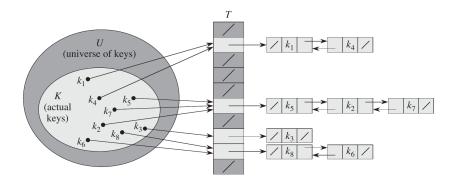
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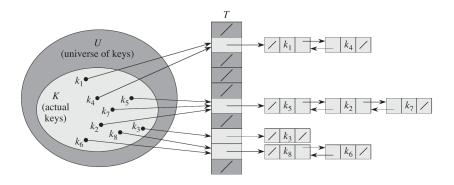
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- Resolving collision: Use chaining
 In chaining, we place all the elements that hash to the same slot into the same linked list.

Collision resolution by chaining



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▶ Each slot contains pointer to the head of the linked list.

Operations on Hash table with chaining

CHAINED-HASH-INSERT (T, x)

1 LIST-PREPEND (T[h(x.key)], x)

CHAINED-HASH-SEARCH (T, k)

1 **return** LIST-SEARCH(T[h(k)], k)

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- ▶ Worst-case running time $\Theta(n)$.

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- ▶ Let length of the linked list at slot T[j] be denoted by n_j .
- Expected value of n_j , $E[n_j] = \alpha = n/m$
- ▶ Time required to search an element with key k depends linearly on the length $n_{h(k)}$ of the list T[h(k)].

Hashing with chaining: SEARCH average-case time

Theorem: (Unsuccessful search)

In a hash table in which collisions are resolved by chaining, an unsuccessful search takes average-case time $\Theta(1+\alpha)$, under the assumption of independent uniform hashing.

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Theorem: (Successful search)

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- Goal : Come up with heuristic methods to achieve independent uniform hashing.

Creating Hash functions

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- Closely related symbols (pt and pts) often occur in the same program.
- ► The computed hash value should be independent of any pattern that might exist in the keys.

$$\mathbb{N} = \{0, 1, 2, \ldots\}$$

Most hash functions assume that the universe of keys is the set of natural numbers.

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- In our discussion, we will assume that keys are natural numbers.

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- ▶ A good choice for *m* : A prime number that is not too close to any power of 2.

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Also, m = 701 is not close to any power of 2.

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$$\frac{\sqrt{5}-1}{2}=0.6180339887\dots$$



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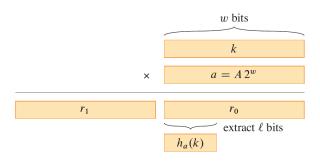
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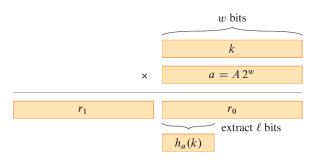
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- So, the fraction part of kA is not uniformly distributed in the interval (0,1).
- ▶ When *A* is an irrational number, the pattern in the fractional part of *kA* becomes less predictable (there is no recurring pattern).

Multiply-shift Method



Product (2-w bit value) = $r_1 2^w + r_0$

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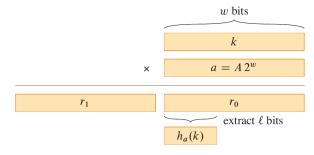


- Product (2-w bit value) = $r_1 2^w + r_0$
- $h_a(k) = (k a \mod 2^w) \ggg (w l)$

Static Hashing vs. Random Hashing

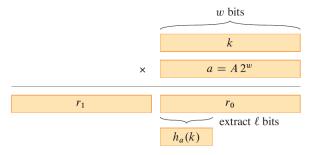
Static Hashing vs. Random Hashing

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► $h(k) = (k(2^w A) \mod 2^w) \gg (w - l)$

Motivation for Random Hashing

Denial-of-service attack based on Session IDs.

Motivation for Random Hashing

- Denial-of-service attack based on Session IDs.
- ► Hash value of IP address.

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- ightharpoonup p is chosen large enough such that every possible key $k \in \mathbb{Z}_p$.
- Family of hash functions : $\mathcal{H} = \{h_{ab} : a \in \mathbb{Z}_p^* \text{ and } b \in \mathbb{Z}_p\}$

- ▶ $h_{ab}(k) = ((ak+b) \mod p) \mod m$ where $a \in \{1, \dots, p-1\}$ and $b \in \{0, 1, \dots, p-1\}$. $\mathbb{Z}_p^* = \{1, \dots, p-1\}$, $\mathbb{Z}_p = \{0, 1, \dots, p-1\}$
- Example, p = 19, m = 8, a = 2 and b = 3: What is $h_{2,3}(10)$? 4
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▶ Let h be a hash function that is picked uniformly randomly from H_{pm}:

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- **Theorem :** The family \mathcal{H}_{pm} of hash functions defined below is universal.

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Proof:

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- Family of hash functions:

$$h_a(k) = \mathsf{SHA}\text{-}256(a \parallel k) \mod m$$

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