Data Structures and Algorithms

Lecture – week 8

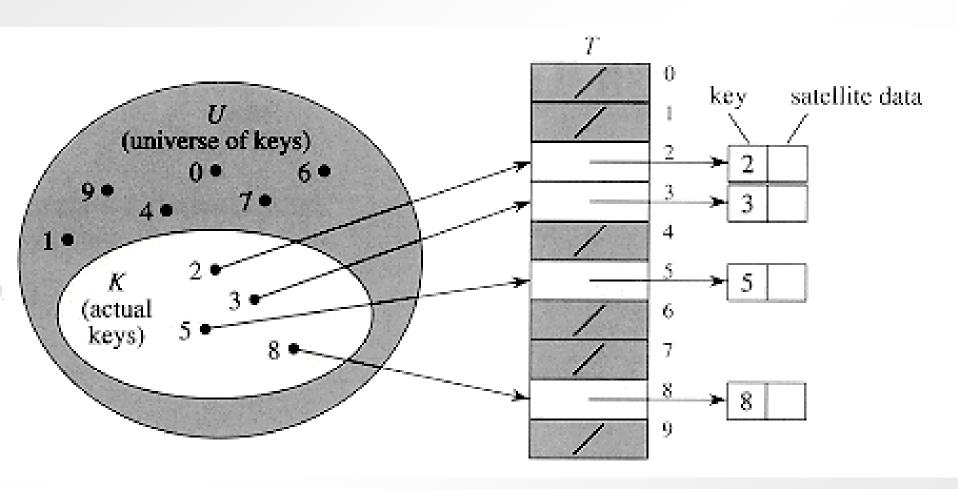
- Direct Access Table
- Hash Function, Hash Table
 - & Collision Resolution Methods

Lect. PhD. Lupsa Dana Babes - Bolyai University Computer Science and Mathematics Faculty 2022 - 2023

Data Structures and Algorithms

Previously, in Lecture 6

- Priority Queue. Possible representation
 - Binary Heap
- Heap-sort



Problem:

- We have data where every element has a key (a natural number).
- The universe of keys (the possible values for the keys) is relatively small, $U = \{0; 1; 2; ...; m-1\}$
- No two elements have the same key
- We have to support the basic dictionary operations: INSERT,
 DELETE and SEARCH

Idea:

Use an array that has one position for every possible key

Applicable: when we can afford to ... the universe *U* of keys is reasonably small

Operations:

function search(T, k) is: search \leftarrow T[k] end-function

subalgorithm insert(T, x) is: $T[\text{key}(x)] \leftarrow x$

end-subalgorithm

subalgorithm delete(T, x) is: $T[key(x)] \leftarrow NIL$ end-subalgorithm

Notations:

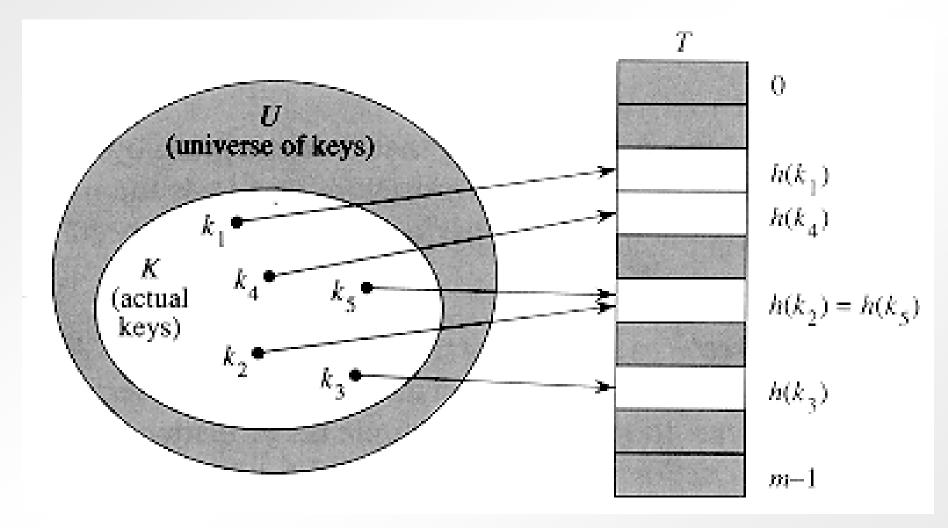
T is an array (the direct-address table), k is a key x is an element key(x) returns the key of an element

Complexity: ...?

Think about:

• Assume that we have a direct address T of length m. How can we find the maximum element of the direct-address table? What is the complexity of the operation?

Hash table



Source: Cormen

Collisions

- When two keys, x and y, have the same value for the hash function h(x) = h(y) we have a collision.
- Which hash function?

Collision resolution methods:

- Separate chaining
- Coalesced chaining
- Open addressing

Birthday paradox

- perfect hash function
 - injective: maps distinct elements with no collisions
 - it is too expensive to compute it for every input
- → build a hash function to minimize collisions good hash function

In practice:

 use heuristic information to create a hash function that is likely to perform well

Choose between:

- simple and fast, but have a high number of collisions;
- more complex functions, with better quality, but take more time to calculate

A good hash function:

- is deterministic
- can be computed in $\Theta(1)$ time
- satisfies (approximately) the assumption of **simple uniform hashing**: each key is equally likely to hash to any of the m slots, independently of where any other key has hashed to:

$$P(h(k) = j) = \frac{1}{m} \quad \forall j = 0, ..., m-1 \ \forall k \in U$$

- ➤ The simple uniform hashing theorem is hard to satisfy, especially when we do not know the distribution of data. Data does not always have a uniform distribution.
- ➤ In practice we use heuristic techniques to create hash functions that perform well.
- Most hash functions assume that the keys are natural numbers. If this is not true, they have to be interpreted as natural number.

Bad hash functions

- h(k) = constant number
- assuming that the keys are CNP numbers:

```
assume m = 100 and you use the birth day from the CNP (as a number):
```

h(CNP) = birthdayyear % 100

Data does not always have a uniform distribution.

e.g.: dates, group numbers at our faculty, letter of an English word

Good hash function

Need: qualitative information about P

Assume: uniform distributed keys

Example:

• keys are random real numbers independently and uniformly distributed in the range [0,1).

$$h(k) = [k * m]$$

satisfies the simple uniform hashing property

• keys are random integers independently and uniformly distributed in the range 0 to N-1

where N much larger than m

$$h(k) = k \mod m$$

satisfies the simple uniform hashing property

The division method

$$h(k) = k \mod m$$

• Experiments show that good values for m are primes not too close to exact powers of 2

Mid-square method

 For getting the hash of a number, multiply it by itself and take the middle r digits.

e.g.:

Assume that the table size is 10^{r} , for example m = 100 (r = 2) h(4567) = middle 2 digits of 4567 * 4567= middle 2 digits of 20857489 = 57

• Same thing for: $m = 2^r$ and the binary representation of the numbers

e.g.:

$$m = 2^4$$
,
h(1011) = middle 4 digits of 01111001 = 1110

The multiplication method

h(k) = floor(m * frac(k * A))

where

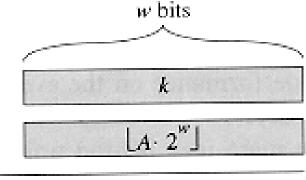
m - hash table size

A - constant in the range 0 < A < 1

Remark:

• the value of *m* is not critical

source: Cormen



 $m = 2^p$ for some integer p

> implementation:

restrict A to w bits, w=machine word size.

 r_1 r_0 extract p bits h(k)

X

The multiplication method

good value for A (experimental)

$$A \approx \frac{\sqrt{5} - 1}{2} \approx 0.6180339887$$

Donald Knuth, The Art of Computer Programming, 1968

Numeric example:

$$k = 123456$$

 $m = 10000$

$$A = 0.6180339887...$$

$$h(k) = floor(41.151...) = 41$$

$$k = 50$$

$$h(k) = 9016$$

	Multiplication Method	Division Method
m	1000	1000
A	0.618033988749895	
key	h(key) = floor(m * frac(key * A))	$h(key) = key \ mod \ 1000$
123456	4	456
12345 <mark>9</mark>	858	459
1234 <mark>9</mark> 6	725	496
123 <mark>9</mark> 56	21	956
12 <mark>9</mark> 456	208	456
1 <mark>9</mark> 3456	383	456
<mark>9</mark> 23456	195	456

4/28/2023 the value of m is not critical

Universal hashing

- Instead of having one hash function, we have a collection **#** of hash functions that map a given universe U of keys into the range $\{0, 1, ..., m-1\}$
- Such a collection is said to be universal if for each pair of distinct keys x, y ∈ U the number of hash functions from the for which h(x) = h(y) is precisely: | the pair of hash functions from the forwhich h(x) = h(y) is precisely: | the h(y) is precisely:
- In other words, with a hash function randomly chosen from
 # the chance of collision between x and y, where x ≠ y, is
 exactly 1/m

Universal hashing

Example 1

Fix a prime number p > the maximum possible value for a key from <math>U.

For every $a \in \{1, \ldots, p-1\}$ and $b \in \{0, \ldots, p-1\}$ we can define a hash function $h_{a,b}(k) = ((a * k + b) \mod p) \mod m$.

Example 2

If the key k is an array $< k_1, k_2, \ldots, k_r >$ such that $k_i < m$ (or it can be transformed into such an array, by writing the k as a number in base m).

Let $< x_1, x_2, ..., x_r >$ be a fixed sequence of random numbers, such that $x_i \in \{0, ..., m-1\}$ (another number in base m with the same length).

$$h(k) = \sum_{i=1}^{r} k_i * x_i \mod m$$

How many hash functions in collection?

Universal hashing

Example 3

Suppose the keys are u - bits long and $m = 2^b$.

Pick a random b - by - u matrix (called h) with 0 and 1 values only.

Pick h(k) = h * k where in the multiplication we do addition mod 2.

$$\begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 \\ 1 & 1 & 1 & 0 \end{pmatrix} \begin{pmatrix} 1 \\ 0 \\ 1 \\ 0 \end{pmatrix} = \begin{pmatrix} 1 \\ 1 \\ 0 \end{pmatrix}$$

What can we do if keys are not natural numbers?

Define special hash functions that work with your keys

e.g.: for k - real nr. from [0,1) use: h(k) = [k * m]

 Use a hashCode function that transforms the key to a natural number

Hash function: transforming the key into a natural number

e.g.:

If the key is a string s:

- we can consider the ASCII codes for every letter
- we can use 1 for a, 2 for b, etc.

hashCode: s[0] + s[1] + ... + s[n - 1]

But: Anagrams have the same sum (see: SAUCE and CAUSE)

Assuming maximum length of 10 for a word (and the second letter representation), hashCode values range from 1 (the word a) to 260 (zzzzzzzzzz). Considering a dictionary of about 50,000 words, how many words would we have for a hashCode value, on average?

hashCode: $s[0] * 26^{n-1} + s[1] * 26^{n-2} + ... + s[n - 1]$ where n - the length of the string

• Instead of 26 (which was chosen since we have 26 letters) we can use a prime number as well (Java uses 31, for example).

Hash function when keys are not uniformly distributed

Need: qualitative information about P

Special-purpose hash function

 exceptionally good for a specific kind of data no performance on data with different distribution

Example:

input data: file names such as FILE0000.CHK, FILE0001.CHK, FILE0002.CHK, etc., with mostly sequential numbers.

extracts the numeric part k of the file name fn
 h(fn) = numeric_part(fn) mod m

Example:

input data: text in any natural language

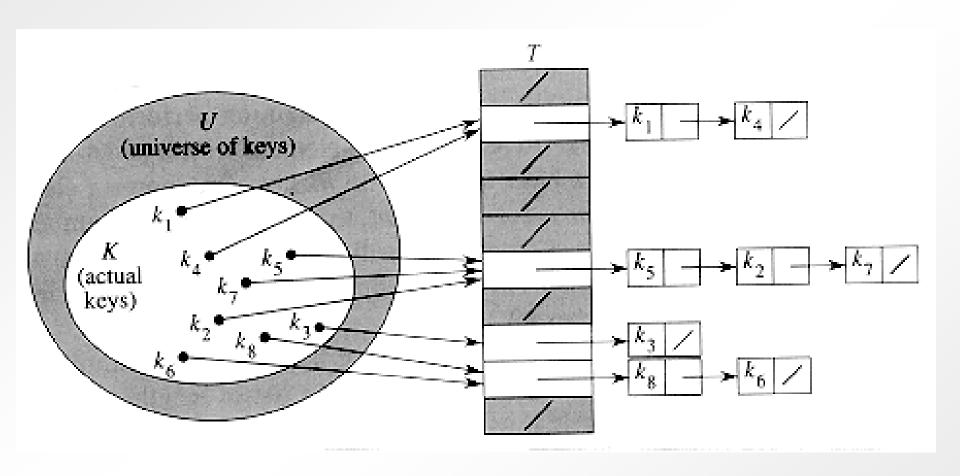
has highly non-uniform distributions of characters, and character pairs, very characteristic of the language

 it is prudent to use a hash function that depends on all characters of the string—and depends on each character in a different way

"The design of the "hash function" is somewhat of a black art. It can be highly influenced by the data that's intended to be stored in the hashing-based data structure, so the discussion on a sensible hashing function can often stray into a discussion about specific inputs. "

(someone on stackoverflow...)

Collision resolution: separate chaining



By default, in these classes, separate chaining will use an SLL.

Collision resolution: separate chaining

Representation:

Node:

key: TKey next: ↑ Node

HashTable:

T: (↑ Node) [] m: Integer h: TFunction

Operations:

```
insert (T,x)
insert x at the head of list T[h(key[x])]
search(T,k)
search for an element with key k in list T[h(k)]
delete (T,x)
delete x from the list T[h(key[x])]
```

Remark: By default, we will consider having only keys.

Analysis of hashing with chaining

The average performance depends on how well the hash function he can distribute the keys to be stored among the m slots.

Assumptions:

- the hash value can be computed in constant time
- hash function satisfy Simple Uniform Hashing Assumption

Load factor α of table T with **m** slots containing **n** elements is n/m

represents the average number of elements stored in a chain

Analysis of hashing with chaining

- Insert WC: Θ(1)
- Search
- Delete

Analysis of hashing with chaining: Search

Theorem:

In a hash table in which collisions are resolved by separate chaining, an unsuccessful search takes (1 + α), on the average, under the assumption of simple uniform hashing.

Theorem:

In a hash table in which collisions are resolved by chaining, a successful search takes (1 + α), on the average, under the assumption of simple uniform hashing.

• Proof idea: (1) is needed to compute the value of the hash function and α is the average time needed to search one of the m lists

Think about: WC for search

Can we do better than by using SLL?

Separate chaining. Variations

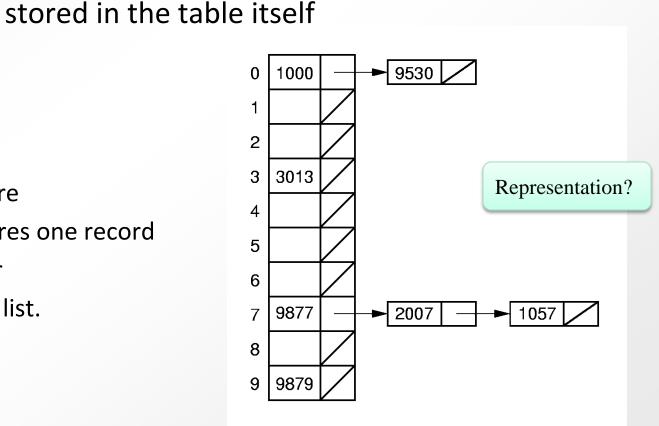
Use another data structure instead of a SLL

e.g.: use balanced tree

• Elements: stored external to the table

Example:

a hash table where
each location stores one record
and a link pointer
to the rest of the list.



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Think about:

Assume we have a hash table with m = 6 that uses separate chaining for collision resolution, with the following policy: if the load factor of the table after an insertion is greater than or equal to 0.7, we double the size of the table

• Using the division method, insert the following elements, in the given order, in the hash table: 38, 11, 8, 72, 57, 29, 2.

Iterator for a hash table with separate chaining

- How can we implement the *init* operation? BC, WC?
- How can we implement the *getCurrent* operation?
- How can we implement the *next* operation?
- How can we implement the *valid* operation?

Think about:

• Suppose we use a hash function **h** to hash **n** distinct keys in a table T of size **m**. What is the average number of collisions?

(the probable cardinal of $\{(x,y) \in TKey \times TKey : d(x) = d(y)\}$)

- Show that if $|U| > n \cdot m$, then there is a subset of U of size **n** containing keys that all hashes to the same slot, so that the search time, in the worst case, is $\Theta(n)$.
- Suppose we use a hash table with separate chaining, but each list is sorted by key. What is the time-complexity for search (successfully, unsuccessfully), add, and delete?
- Can we define a sorted container on a hash table with separate chaining?

Direct address & hash table

Think about:

Finding the maximum key

- Assume that we have n keys in a direct address T of length m. How can we find the maximum key of the direct-address table? What is the complexity of the operation?
- How does the operation for finding the maximum change if we have a hash table, instead of a direct-address table (consider collision resolution by separate chaining)?

Hash table in programming languages

• Hash tables are an effective way to implement containers if we want to achieve good performance for **search**, **insert** and **delete**

JAVA Util

- HashSet
- HashMap

C++ STL

- unordered_set
- unordered_map

They use hash table with separate chaining.

Hash table in programming languages

Java.util

HashSet

- implements the Set interface; uses a hash table

HashMap

- implements the Map interface; uses a hash table
- HashMap()

Constructs an empty HashMap with the default initial capacity (16) and the default load factor (0.75).

HashMap(int initialCapacity)

Constructs an empty HashMap with the specified initial capacity and the default load factor (0.75).

HashMap(int initialCapacity, float loadFactor)

Constructs an empty HashMap with the specified initial capacity and load factor.

Hash in programming languages. Examples

Java Object

public int hashCode()

As much as is reasonably practical, the hashCode method defined by class Object does return distinct integers for distinct objects. (This is typically implemented by converting the internal address of the object into an integer, but this implementation technique is not required by the JavaTM programming language.)

public boolean equals(Object obj)

If two objects are equal then they must return same hash code (when they are compared by equals())