

## CSE 373 Lecture 13: Hashing

- ◆ Today's Topics:
  - ⇒ Collision Resolution
    - ◆ Separate Chaining
    - ◆ Open Addressing
      - Linear/Quadratic Probing
      - Double Hashing
    - ◆ Rehashing
    - ◆ Extendible Hashing
- ◆ Covered in Chapter 5 in the text

## Review of Hashing

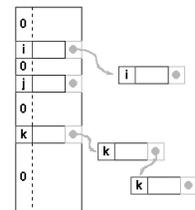
- ◆ Idea: Store data record in array slot  $A[i]$  where  $i = \text{Hash}(key)$
- ◆ If keys are integers, we can use the hash function:
  - ⇒  $\text{Hash}(key) = key \bmod \text{TableSize}$
  - ⇒  $\text{TableSize}$  is size of the array (preferably a prime number)
- ◆ If keys are strings (in the form  $\text{char } *key$ ), get integers by treating characters as digits in base 27 (using "a" = 1, "b" = 2, "c" = 3, "d" = 4 etc.)
  - ⇒  $\text{Hash}(key) = \text{StringInt}(key) \bmod \text{TableSize}$
  - ⇒  $\text{StringInt}(\text{"abc"}) = 1*27^2 + 2*27^1 + 3 = 786$
  - ⇒  $\text{StringInt}(\text{"bca"}) = 2*27^2 + 3*27^1 + 1 = 1540$
  - ⇒  $\text{StringInt}(\text{"cab"}) = 3*27^2 + 1*27^1 + 2 = 2216$

## Collisions and their Resolution

- ◆ A collision occurs when two different keys hash to the same value
  - ⇒ E.g. For  $\text{TableSize} = 17$ , keys 18 and 35 hash to the same value
  - ⇒  $18 \bmod 17 = 1$  and  $35 \bmod 17 = 1$
- ◆ Cannot store both data records in the same slot in array!
- ◆ Two different methods for collision resolution:
  - ⇒ **Separate Chaining:** Use data structure (such as a linked list) to store multiple items that hash to the same slot
  - ⇒ **Open addressing (or probing):** search for other slots using a second function and store item in first empty slot that is found

## Collision Resolution by Separate Chaining

- ◆ Each hash table cell holds pointer to linked list of records with same hash value (i, j, k in figure)
- ◆ Collision: Insert item into linked list
- ◆ To Find an item: compute hash value, then do Find on linked list
- ◆ Can use List ADT for Find/Insert/Delete in linked list
- ◆ Can also use BSTs:  $O(\log N)$  time instead of  $O(N)$ . But lists are usually small – not worth the overhead of BSTs



## Separate Chaining: In-Class Example

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- ◆ Insert 10 random keys between 0 and 100 into a hash table with  $TableSize = 10$

## Load Factor of a Hash Table

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- ◆ Let  $N$  = number of items to be stored
- ◆ **Load factor  $\lambda = N/TableSize$**
- ◆ What is  $\lambda$  for our example?
- ◆ Suppose  $TableSize = 2$  and number of items  $N = 10$ 
  - ⇒  $\lambda = 5$
- ◆ Suppose  $TableSize = 10$  and number of items  $N = 2$ 
  - ⇒  $\lambda = 0.2$
- ◆ Average length of chained list =  $\lambda$
- ◆ Average time for accessing an item =  $O(1) + O(\lambda)$ 
  - ⇒ Want  $\lambda$  to be close to 1 (i.e.  $TableSize \approx N$ )
  - ⇒ But chaining continues to work for  $\lambda > 1$

## Collision Resolution by Open Addressing

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- ◆ Linked lists can take up a lot of space...
- ◆ Open addressing (or probing): When collision occurs, try alternative cells in the array until an empty cell is found
- ◆ Given an item  $X$ , try cells  $h_0(X), h_1(X), h_2(X), \dots, h_i(X)$
- ◆  $h_i(X) = (\text{Hash}(X) + F(i)) \bmod TableSize$ 
  - ⇒ Define  $F(0) = 0$
- ◆  $F$  is the collision resolution function. Three possibilities:
  - ⇒ Linear:  $F(i) = i$
  - ⇒ Quadratic:  $F(i) = i^2$
  - ⇒ Double Hashing:  $F(i) = i \cdot \text{Hash}_2(X)$

## Open Addressing I: Linear Probing

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- ◆ **Main Idea:** When collision occurs, scan down the array one cell at a time looking for an empty cell
  - ⇒  $h_i(X) = (\text{Hash}(X) + i) \bmod TableSize$  ( $i = 0, 1, 2, \dots$ )
  - ⇒ Compute hash value and increment it until a free cell is found
- ◆ **Example:** Insert  $\{18, 19, 20, 29, 30, 31\}$  into empty hash table with  $TableSize = 10$

## Load Factor Analysis of Linear Probing

- ◆ Recall: **Load factor**  $\lambda = N/TableSize$
- ◆ Fraction of empty cells =  $1 - \lambda$
- ◆ Number of such cells we expect to probe =  $1/(1 - \lambda)$
- ◆ Can show that expected number of probes for:
  - ⇒ Successful searches =  $O(1 + 1/(1 - \lambda))$
  - ⇒ Insertions and unsuccessful searches =  $O(1 + 1/(1 - \lambda)^2)$
- ◆ Keep  $\lambda \leq 0.5$  to keep number of probes small (between 1 and 5). (E.g. What happens when  $\lambda = 0.99$ )

## Drawbacks of Linear Probing

- ◆ Works until array is full, but as number of items  $N$  approaches  $TableSize$  ( $\lambda \approx 1$ ), access time approaches  $O(N)$
- ◆ Very prone to cluster formation (as in our example)
  - ⇒ If a key hashes into a cluster, finding a free cell involves going through the entire cluster
  - ⇒ Inserting this key at the end of cluster *causes the cluster to grow* → future Inserts will be even more time consuming!
  - ⇒ This type of clustering is called *Primary Clustering*
- ◆ Can have cases where table is empty except for a few clusters
  - ⇒ Does not satisfy good hash function criterion of distributing keys uniformly

## Open Addressing II: Quadratic Probing

- ◆ Main Idea: Spread out the search for an empty slot – Increment by  $i^2$  instead of  $i$
- ◆  $h_i(X) = (\text{Hash}(X) + i^2) \bmod TableSize$  ( $i = 0, 1, 2, \dots$ )
  - ⇒ No primary clustering but secondary clustering possible
- ◆ Example 1: Insert {18, 19, 20, 29, 30, 31} into empty hash table with  $TableSize = 10$
- ◆ Example 2: Insert {1, 2, 5, 10, 17} with  $TableSize = 16$ 
  - ⇒ Note:  $25 \bmod 16 = 9$ ,  $36 \bmod 16 = 4$ ,  $49 \bmod 16 = 1$ , etc.
- ◆ Theorem: If  $TableSize$  is prime and  $\lambda < 0.5$ , quadratic probing will always find an empty slot

## Open Addressing III: Double Hashing

- ◆ Idea: Spread out the search for an empty slot by using a second hash function
  - ⇒ No primary or secondary clustering
- ◆  $h_i(X) = (\text{Hash}(X) + i \cdot \text{Hash}_2(X)) \bmod TableSize$  for  $i = 0, 1, 2, \dots$
- ◆ E.g.  $\text{Hash}_2(X) = R - (X \bmod R)$ 
  - ⇒  $R$  is a prime smaller than  $TableSize$
- ◆ Try this example: Insert {18, 19, 20, 29, 30, 31} into empty hash table with  $TableSize = 10$  and  $R = 7$
- ◆ No clustering but slower than quadratic probing due to  $\text{Hash}_2$

## Rehashing

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- ◆ Need to use *lazy deletion* if we use probing (why?)
  - ↳ Need to mark array slots as deleted after Delete
- ◆ If table gets too full ( $\lambda \approx 1$ ) or if many deletions have occurred, running time gets too long and Inserts may fail
- ◆ Solution: *Rehashing* – Build a bigger hash table (of size  $2 * TableSize$ ) when  $\lambda$  exceeds a particular value
  - ↳ Cannot just copy data from old table → bigger table has a new hash function
  - ↳ Go through old hash table, ignoring items marked deleted
  - ↳ Recompute hash value for each non-deleted key and put the item in new position in new table
- ◆ Running time is  $O(N)$  but happens very infrequently

## Extendible Hashing

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- ◆ A method of hashing used when large amounts of data are stored on disks → can find data in 2 disk accesses
- ◆ Could use B-trees but deciding which of many children contains the data takes time
- ◆ Extendible Hashing: Store data according to bit patterns
  - ↳ Root contains pointers to sorted data bit patterns stored in leaves
  - ↳ Leaves contain  $\leq M$  data bit patterns with  $d_l$  identical leading bits
  - ↳ Root is known as the directory;  $M$  is the size of a disk block
  - ↳ Requires bits to be nearly random, so hash keys to long integers
- ◆ E.g.: Leaves store bit patterns with 2 identical leading bits
  - ↳ See text (page 169)

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Wednesday's Class will be a *Lab Session* for help with the programming assignment (no lecture)

*Where:* Communications Bldg. B-027 and B-022

*When:* 11:30am-12:30pm

Charles and Jiwon will be in the lab to answer questions

To Do:

Finish reading Chapter 5

Programming Assignment #1 (due April 27)