



CSE332: Data Abstractions

Lecture 10: Hashing

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Announcements

- **Project 2** – posted!
- **Homework 3** – due Friday Jan 28st at the BEGINNING of lecture

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Today

- Dictionaries
 - Hashing

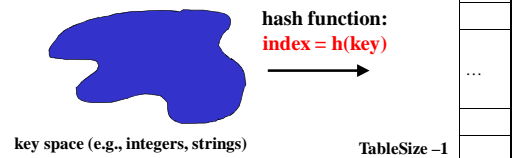
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Hash Tables

- Aim for constant-time (i.e., $O(1)$) **find**, **insert**, and **delete**
 - “On average” under some reasonable [assumptions](#)
- A hash table is an array of some fixed size

- Basic idea:



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Hash tables

- There are m possible keys (m typically large, even infinite) but we expect our table to have only n items where n is much less than m (often written $n \ll m$)

Many dictionaries have this property

- Compiler: All possible identifiers allowed by the language vs. those used in some file of one program
- Database: All possible student names vs. students enrolled
- AI: All possible chess-board configurations vs. those considered by the current player
- ...

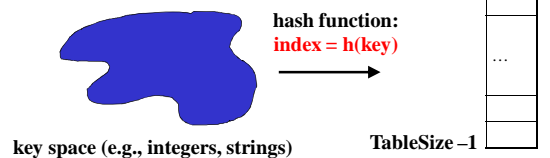
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Hash functions

An ideal hash function:

- Is fast to compute
- “Rarely” hashes two “used” keys to the same index
 - Often impossible in theory; easy in practice
 - Will handle *collisions* a bit later

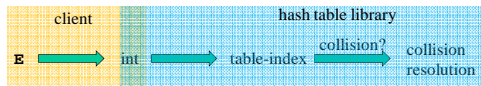


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Who hashes what?

- Hash tables can be generic
 - To store elements of type E , we just need E to be:
 - Comparable: order any two E (like with all dictionaries)
 - Hashable: convert any E to an `int`
- When hash tables are a reusable library, the division of responsibility generally breaks down into two roles:



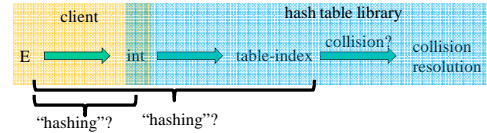
- We will learn both roles, but most programmers "in the real world" spend more time as clients while understanding the library

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More on roles

Some ambiguity in terminology on which parts are "hashing"



Two roles must both contribute to minimizing collisions (heuristically)

- Client should aim for different ints for expected items
 - Avoid "wasting" any part of E or the 32 bits of the `int`
- Library should aim for putting "similar" `ints` in different indices
 - conversion to index is almost always "mod table-size"
 - using prime numbers for table-size is common

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What to hash?

In lecture we will consider the two most common things to hash: integers and strings

- If you have objects with several fields, it is usually best to have most of the "identifying fields" contribute to the hash to avoid collisions
- Example:


```

class Person {
    String first; String middle; String last;
    int age;
}
      
```
- An inherent trade-off: hashing-time vs. collision-avoidance
 - Bad idea(?): Only use first name
 - Good idea(?): Only use middle initial
 - Admittedly, what-to-hash is often an unprincipled guess ☹

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Hashing integers

- key space = integers
- Simple hash function:
 - $h(\text{key}) = \text{key} \% \text{TableSize}$
 - Client: $f(x) = x$
 - Library: $g(x) = x \% \text{TableSize}$
 - Fairly fast and natural
- Example:
 - TableSize = 10
 - Insert 7, 18, 41, 34, 10
 - (As usual, ignoring data "along for the ride")

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	

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Hashing integers (Soln)

- key space = integers
- Simple hash function:
 - $h(\text{key}) = \text{key} \% \text{TableSize}$
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 - Fairly fast and natural
- Example:
 - TableSize = 10
 - Insert 7, 18, 41, 34, 10
 - (As usual, ignoring data "along for the ride")

0	10
1	41
2	
3	
4	34
5	
6	
7	7
8	18
9	

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Collision-avoidance

- With " $x \% \text{TableSize}$ " the number of collisions depends on
 - the ints inserted (obviously)
 - TableSize
- Larger table-size tends to help, but not always
 - Example: 7, 18, 41, 34, 10 with TableSize = 10 and TableSize = 7
- Technique: Pick table size to be prime. Why?
 - Real-life data tends to have a pattern, and "multiples of 61" are probably less likely than "multiples of 60"
 - Later we'll see that one collision-handling strategy does provably better with prime table size

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More arguments for a prime table size

If `TableSize` is 60 and...

- Lots of data items are multiples of 5, wasting 80% of table
- Lots of data items are multiples of 10, wasting 90% of table
- Lots of data items are multiples of 2, wasting 50% of table

If `TableSize` is 61...

- Collisions can still happen, but 5, 10, 15, 20, ... will fill table
- Collisions can still happen but 10, 20, 30, 40, ... will fill table
- Collisions can still happen but 2, 4, 6, 8, ... will fill table

In general, if x and y are "co-prime" (means $\gcd(x, y) = 1$), then
 $(a * x) \% y == (b * x) \% y$ if and only if $a \% y == b \% y$
 – So good to have a `TableSize` that has not common factors with any "likely pattern" x

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What if the key is not an int?

- If keys aren't `ints`, the client must convert to an `int`
 - Trade-off: speed and distinct keys hashing to distinct `ints`
- Very important example: Strings
 - Key space $K = s_0s_1s_2...s_{m-1}$
 - (where s_i are chars: $s_i \in [0,52]$ or $s_i \in [0,256]$ or $s_i \in [0,2^{16}]$)
 - Some choices: Which avoid collisions best?

$$1. \quad h(K) = s_0 \% \text{TableSize}$$

$$2. \quad h(K) = \left(\sum_{i=0}^{m-1} s_i \right) \% \text{TableSize}$$

$$3. \quad h(K) = \left(\sum_{i=0}^{m-1} s_i \cdot 52^i \right) \% \text{TableSize}$$

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Specializing hash functions

How might you hash differently if all your strings were web addresses (URLs)?

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Additional operations

- How would we do the following in a hashtable?
 - `findMin()`
 - `findMax()`
 - `predecessor(key)`
- Hashtables really not set up for these; need to search everything, $O(n)$ time
- Could try a hack:
 - Separately store max & min values; update on insert & delete
 - What about '2nd to max value', predecessor, in-order traversal, etc; those are fast in an AVL tree

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Hash Tables vs. Balanced Trees

- In terms of a Dictionary ADT for just `insert`, `find`, `delete`, hash tables and balanced trees are just different data structures
 - Hash tables $O(1)$ on average (assuming few collisions)
 - Balanced trees $O(\log n)$ worst-case
- Constant-time is better, right?
 - Yes, but you need "hashing to behave" (avoid collisions)
 - Yes, but `findMin`, `findMax`, `predecessor`, and `successor` go from $O(\log n)$ to $O(n)$
- **Moral:** If you need to use operations like `findMin`, `findMax`, `printSorted`, `predecessor`, and `successor` often then you may prefer a balanced BST instead.

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Collision resolution

Collision:

When two keys map to the same location in the hash table

We try to avoid it, but number-of-keys exceeds table size

So hash tables should support **collision resolution**

- Ideas?

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Separate Chaining

0	/
1	/
2	/
3	/
4	/
5	/
6	/
7	/
8	/
9	/

Chaining: All keys that map to the same table location are kept in a list (a.k.a. a "chain" or "bucket")

As easy as it sounds

Example: insert 10, 22, 107, 12, 42 with mod hashing and **TableSize** = 10

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Separate Chaining

0	→ 10 /
1	/
2	/
3	/
4	/
5	/
6	/
7	/
8	/
9	/

Chaining: All keys that map to the same table location are kept in a list (a.k.a. a "chain" or "bucket")

As easy as it sounds

Example: insert 10, 22, 107, 12, 42 with mod hashing and **TableSize** = 10

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Separate Chaining

0	→ 10 /
1	/
2	→ 22 /
3	/
4	/
5	/
6	/
7	/
8	/
9	/

Chaining: All keys that map to the same table location are kept in a list (a.k.a. a "chain" or "bucket")

As easy as it sounds

Example: insert 10, 22, 107, 12, 42 with mod hashing and **TableSize** = 10

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Separate Chaining

0	→ 10 /
1	/
2	→ 22 /
3	/
4	/
5	/
6	/
7	→ 107 /
8	/
9	/

Chaining: All keys that map to the same table location are kept in a list (a.k.a. a "chain" or "bucket")

As easy as it sounds

Example: insert 10, 22, 107, 12, 42 with mod hashing and **TableSize** = 10

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Separate Chaining

0	→ 10 /
1	/
2	→ 12 → 22 /
3	/
4	/
5	/
6	/
7	→ 107 /
8	/
9	/

Chaining: All keys that map to the same table location are kept in a list (a.k.a. a "chain" or "bucket")

As easy as it sounds

Example: insert 10, 22, 107, 12, 42 with mod hashing and **TableSize** = 10

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Separate Chaining

0	→ 10 /
1	/
2	→ 42 → 12 → 22 /
3	/
4	/
5	/
6	/
7	→ 107 /
8	/
9	/

Chaining: All keys that map to the same table location are kept in a list (a.k.a. a "chain" or "bucket")

As easy as it sounds

Example: insert 10, 22, 107, 12, 42 with mod hashing and **TableSize** = 10

Worst case time for find?

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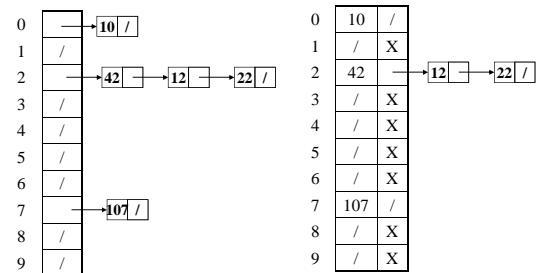
Thoughts on separate chaining

- Worst-case time for **find**?
 - Linear
 - But only with really bad luck or bad hash function
 - So not worth avoiding (e.g., with balanced trees at each bucket)
 - Keep # of items in each bucket small
 - Overhead of AVL tree, etc. not worth it for small n
- Beyond asymptotic complexity, some “data-structure engineering” may be warranted
 - Linked list vs. array or a hybrid of the two
 - Move-to-front (part of Project 2)
 - Leave room for 1 element (or 2?) in the table itself, to optimize constant factors for the common case
 - A time-space trade-off...

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Time vs. space (constant factors only here)



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More rigorous separate chaining analysis

Definition: The **load factor**, λ , of a hash table is

$$\lambda = \frac{N}{\text{TableSize}} \quad \leftarrow \text{number of elements}$$

Under chaining, the average number of elements per bucket is ____

So if some inserts are followed by *random* finds, then on average:

- Each unsuccessful **find** compares against ____ items
- Each successful **find** compares against ____ items
- How big should TableSize be??

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More rigorous separate chaining analysis

Definition: The **load factor**, λ , of a hash table is

$$\lambda = \frac{N}{\text{TableSize}} \quad \leftarrow \text{number of elements}$$

Under chaining, the average number of elements per bucket is λ

So if some inserts are followed by *random* finds, then on average:

- Each unsuccessful **find** compares against λ items
- Each successful **find** compares against $\lambda/2$ items
- If λ is low, find & insert likely to be $O(1)$
- We like to keep λ around 1 for separate chaining

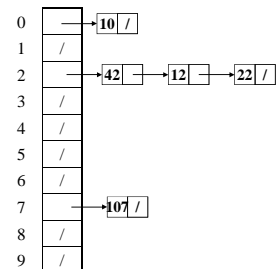
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Separate Chaining Deletion?

Separate Chaining Deletion

- Not too bad
 - Find in table
 - Delete from bucket
- Say, delete 12
- Similar run-time as insert



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