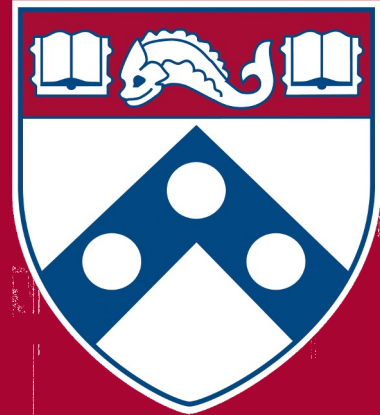


Closed Hashing:

Quadratic Probing, Double Hashing,
and Analysis

CIT594





Last Time: Closed Hashing



Closed Hashing

- A hash system where *all records are stored in slots inside the hash table*
- Implementations:
 - **Closed hashing with buckets**
 - **Closed hashing with no buckets**



Closed Hashing with No Buckets



Collision Resolution Policy

- The process of **finding the proper position** in a hash table that contains the desired record
- Used if the hash function did not return the correct position for that record due to a **collision** with another record
- Mainly used in closed hashing systems with no buckets
- A good collision should ensure that **empty slots** in the table **have** an **equal probability of receiving the next record inserted**

Collision Resolution

- Goal: find a free slot in the hash table when the home position for the record is already occupied
- Uses a **probe function**

Collision Resolution

- **Probe function:** function used by a *collision resolution* method to calculate where to look next in the *hash table*
- **Probe sequence:** the series of *slots* visited by the *probe_function* during *collision resolution*.

We will use:

- Hash function: simple mod (%)
- $Slot = key \% array_size$

Collision Resolution

1. Find home slot

- `int pos = home = h(K);` where `h` is the hash function and `K` is the key

2. Probe sequence (iterative process)

- `pos = (home + p(k, i)) % M;`
 - Initialize `i` at 1
 - Increment `i` until the slot at `pos` is empty
- The probe function returns an offset from the original home position



Probe function

Collision Resolution Policies

- Linear probing
- Linear probing by steps
- Pseudo-random probing
- Quadratic probing
- Double hashing

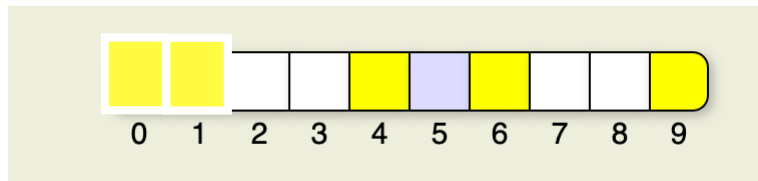
Quadratic Probing

Quadratic Probing

- Eliminates primary clustering
- Probe function is *quadratic*.
- Probe function:
 - $p(k, i) = c_1i^2 + c_2i + c_3$
- Simplest form:
 - $p(k, i) = i^2$
 - Probe sequence: the i^{th} value is: $h(K) + i^2$

Quadratic Probing

- Problem: not all slots visited by the “simplest form” probe function



If a value hashes to slot 5. Only the slots in yellow will be visited

Quadratic Probing

- Solution:
 - Length of hash table: power of 2
 - probe function: $p(k, i) = (i^2 + i) / 2$

All slots will be visited by the probe function

- Given a hash table of length 8, if a value hashes to slot 0, the probe sequence will be: **1, 3, 6, 2, 7, 5, 4**

Quadratic Probing

- Google SparseHash Tables (<https://github.com/sparsehash/sparsehash>)
- Facebook Haystack (photo storage system) uses Google SparseHash Tables (<https://engineering.fb.com/core-data/needle-in-a-haystack-efficient-storage-of-billions-of-photos/>)

Secondary Clustering

- Pseudo-random probing and quadratic probing ignore the key when computing the probe sequence
- Two records with the same home slot will share the same probe sequence
- **Secondary Clustering** results from the keys hashing to the same slot of the table sharing the same probe sequence

Double Hashing

Double Hashing

- Eliminates secondary clustering
- Probe function uses the original key
- Probe function: $p(k, i) = i * h_2(k)$
- h_2 is a second hash function

Double Hashing

- Implementation 1:
 - select M to be a prime number
 - $h_2(k) = 1 + (k \% (M - 1))$
 - $p(k, i) = i * h_2(k)$

Double Hashing

- Example:

$M = 11$

A record with key = 0 will generate the probe sequence: 1, 2, 3, 4, 5, 6, 7, 8, 9, 10

A record with key = 11 will generate the probe sequence: 2, 4, 6, 8, 10, 1, 3, 5, 7, 9

Double Hashing

- Implementation 2:
 - select M to be a power of two
 - h_2 returns an odd number
 - $h_2(k) = (((k/M) \% (M/2)) * 2) + 1$
 - $p(k, i) = i * h_2(k)$

Double Hashing

- Example:

$M = 16$

A record with key = 0 will generate the probe sequence: 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15

A record with key = 16 will generate the probe sequence: 3, 6, 9, 12, 15, 2, 5, 8, 11, 14, 1, 4, 7, 10, 13

Deletion

Deletion

- Challenges:
 - Empty slots should not stop the probe sequence when searching
 - The freed slot should be available to a future insertion

Deletion

- A **tombstone** is used to mark a *slot* in the *hash table* where a record has been deleted.
- **Searching:** if a tombstone is encountered, the probe sequence continues
- **Insertion:** if a tombstone is encountered, that slot is used to store the new record.
- **The insertion procedure must check for duplicates**

Analysis

Analysis of Closed Hashing

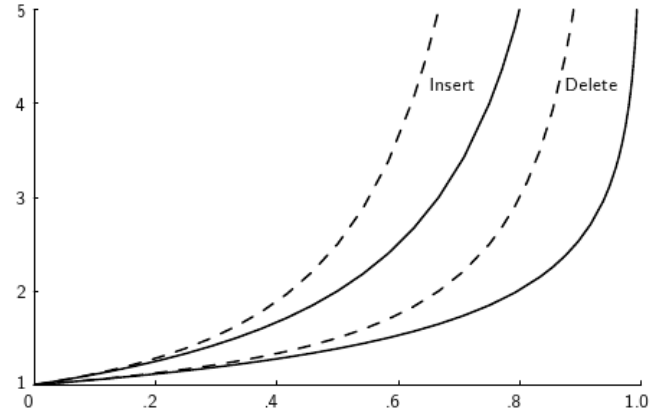
- Assuming that every slot in the table has equal probability of being the home slot for the next record
- The probability of finding the home position is N/M (load factor - α)
- The expected number of probes is:

$$1 + \sum_{i=1}^{\infty} (N/M)^i = 1/(1 - \alpha).$$

- The cost is a function of the load factor

Analysis of Closed Hashing

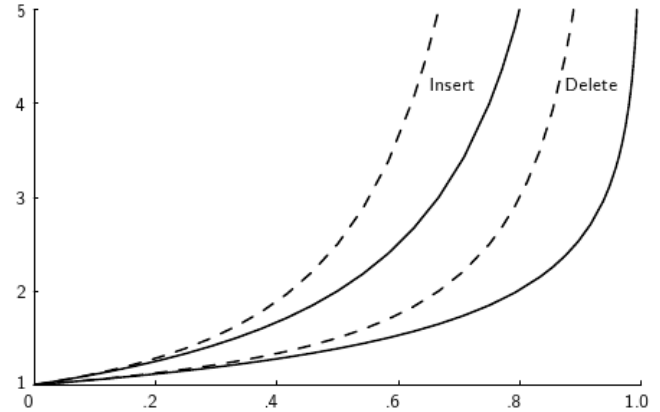
- Horizontal axis is the value for α
- Vertical axis is the expected number of accesses to the hash table
- Dashed lines show the cost for linear probing
- Solid lines show the cost for "random" probing (a theoretical lower bound)



Plot showing the growth rate of the cost for insertion and deletion into a hash table as the load factor.

Analysis of Closed Hashing

- For small values of α , the expected cost is low. It remains below two until the hash table is about half full
- **Rule of thumb:** design a hashing system so that the hash table never gets above about half full
- Select the table size accordingly



Plot showing the growth rate of the cost for insertion and deletion into a hash table as the load factor.