

# CSC2001F: Data Structures II

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# Outline

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- Methods of Creating Hash Functions
  - Division and Multiplication
- Linear Probing – A method of Collision Resolution
- Lazy Deletion
- Primary Clustering
- Summary

# Hash Function: From Keys to Indices

- The mapping of keys to indices of a hash table is achieved using a hash function  $h(k)$ , which usually comprises of two maps:
  - Hash code map:  $\text{key} \rightarrow \text{integer}$
  - Compression map:  $\text{integer} \rightarrow [0, M-1]$
- If your key is already an integer, no need for integer conversion (hash code map)
- A good hash function minimizes possibility of collisions
- $M$  is the size of the array (so an index is a value between  $0 \cdots M - 1$ )

# Methods of Creating Hash Functions

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## ■ Division Method

- Map a key,  $k$ , into one of the slots  $m$  in the hash table by taking the remainder of  $k$  divided by  $m$

- So the hash function is:

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

- Note:

- $K$  is the key (integer value derived from the string conversion)
- $m$  is the size of the array (so an index is a value between 0 and  $m-1$ )

# Division Method - Example

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- Recall: hash code map (string conversion) and then  $h(k)$  evaluation

Name	Key
Sarah Jones	1038
Tony Balognie	1259
Tom Katz	746
John Smith	948

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

$$\text{e.g. } h(746) = 746 \bmod 10 = 6$$

0	
1	
2	
3	
4	
5	
6	Tom Katz
7	
8	Sarah Jones
9	Tony Balognie

# Methods of Creating Hash Functions

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- **Division Method**

- $h(k) = k \bmod m$

- **Choice of  $m$  is critical (division method)**

- $m$  prime is good

- Ensure uniform distribution of keys

- Prime is not too close to exact powers of 2

- Note:  $m$  near power of 2 is not a good choice

- Since  $h(k)$  gives the least significant bits of  $k$

- Many collisions result if the major difference in key values are in the ignored components (bits)

# Methods of Creating Hash Functions

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## ■ Multiplication Method

- Multiply the key  $k$  by a constant  $A$  in the range  $0 < A < 1$  and extract the fractional part of  $KA$
- Multiply this value by  $m$  (tableSize) and take the floor of the result
- So the hash function is:  $h(k) = \lfloor m(KA \bmod 1) \rfloor$

■ **Advantage:** Value of  $m$  is not critical

## ■ Fibonacci Hashing (Knuth's): $A = (\sqrt{5} - 1)/2$

- multiplication hashing method in which the constant  $a$  is chosen uniquely as the **conjugate of the golden ratio**.


# Multiplication Method - Example

## ■ Multiplication Method

- Suppose  $A = 0.62$ , insert the list of names in the table below into a hash table of size 10 using the function:

$$h(k) = \lfloor m(KA \bmod 1) \rfloor$$

Name	Key
Sarah Jones	1038
Tony Balognie	1259
Tom Katz	746
<u>John Smith</u>	<u>948</u>


$$h(746) = \lfloor 10((746 * 0.62) \bmod 1) \rfloor$$
$$10(0.52) = 5$$

$$\rightarrow h(1038) = 5$$

$$\rightarrow h(1259) = 5$$

$$\rightarrow h(746) = 5$$

$$\rightarrow h(948) = 7$$



# A Case of Collision

- **Collision:** when two or more keys hash out to the same position.

$$h(k_i) = h(k_j) \text{ for } k_i, k_j \in U, \wedge k_i \neq k_j$$

- $h(k) = \lfloor m(KA \bmod 1) \rfloor$

Name	Key
Sarah Jones	1038
Tony Balognie	1259
Tom Katz	746
<u>John Smith</u>	<u>948</u>

Results in collision

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	

$$h(746) = \lfloor 10((746 * 0.62) \bmod 1) \rfloor = 5$$

$$\begin{aligned} \rightarrow h(1038) &= 5 \\ \rightarrow h(1259) &= 5 \\ \rightarrow h(746) &= 5 \\ \rightarrow h(948) &= 7 \end{aligned}$$

How do we resolve collision?

# What is Linear Probing?

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- Method of collision resolution
- A collision occurs, in a hash table, when two or more keys hash out to the same index (not one to one)
- **Linear probing:** resolves collision by scanning the array sequentially with wraparound until an empty slot is found.



# Linear Probing - Method

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- If current location is occupied, try the next location.

## **LinearProbingInsert( K )**

If (table is full) throw an exception

probe = h (k);

While (table [probe] occupied)

probe = (probe + 1) mod m;

table[probe] = k;

- Use less memory than chaining, since one does not have to store those links (we will see chaining later).
- BUT! slower than chaining since one might have to search through the table for a long time.

# Linear Probing – An Example

## Collision resolution

Name	Key
Sarah Jones	1038
Tony Balognie	1259
Tom Katz	746
<u>John Smith</u>	<u>948</u>

0	
1	
2	
3	
4	
5	Sarah Jones
6	
7	
8	
9	

What happens if we need to insert others at the same position?

# Linear Probing – An Example

**STEP 1**

0	
1	
2	
3	
4	
5	Sarah Jones
6	
7	
8	
9	

**STEP 2**

0	
1	
2	
3	
4	
5	Sarah Jones
6	Tony Balognie
7	
8	
9	

**STEP 3**

0	
1	
2	
3	
4	
5	Sarah Jones
6	Tony Balognie
7	Tom Katz
8	
9	

**STEP 4**

0	
1	
2	
3	
4	
5	Sarah Jones
6	Tony Balognie
7	Tom Katz
8	John Smith
9	

# Linear Probing – Search Operation

- To search for an item, we go to location “ $h(k)$ ” and scan through **successive slots** until we find the item or encounter an empty location.
  - **Successful search:** to search for “Tom Katz” in the previous example, we go to **location 5** and continue scanning...(location 7)
  - **Unsuccessful search:** we compute the index and check sequentially, once we **encounter an empty slot**, then the item we are searching for is not in the hash table ???

# Exercise – In Class

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- Consider the input {437, 123, 617, 519, 456, 674, 199, 103, 93, 63}, a fixed table size of 10, and a hash function  $h(k) = k \bmod m$

- Show the resulting linear probing hash table
- Now explain what the effect of deleting 123 from the hash table would be. For example what would happen if we were looking for 103, at a later stage?

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	

# Lazy Deletion

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- What happened when an empty slot (cell) cannot be found? How do we avoid “crushing” already inserted values in the hash table?
  - Note: an item in the hash table not only represents itself, connects other items...
- **Definition:** “Lazy deletion is a technique that is used to **mark elements** in a hash table as deleted instead of physically removing them from the table”
- Mitigate the “problem” of (false) **unsuccessful search**, where an item is in the table but cannot be found.



# Lazy Deletion - Usefulness

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- Standard deletion – not possible because of the interconnections between hash table items.

- Hash table elements serve as place holders for collision resolution

- Example: removing 123 would cause all remaining “Search” operations to fail

0		
1		
2		
3	123	1: Deleted!
4	674	
5	103	2: Should be In slot 3!
6		
7		
8		
9		

# Lazy Deletion - Usefulness

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- Solution: Mark each slot as either active or deleted.  
Can use a binary marker – e.g. 1 = active; 0 = deleted.

Index	State	Value
0	0	
1	0	
2	0	
<b>3</b>	<b>1</b>	<b>123</b>
4	1	674
5	1	103
6	0	
7	0	
8	0	
9	0	

The diagram illustrates the state of the array slots. A blue bracket on the right groups indices 0, 1, and 2, which are labeled 'Inactive/deleted' in a blue box. A green bracket groups indices 3, 4, and 5, which are labeled 'active' in a green box. Another blue bracket groups indices 6, 7, 8, and 9, which are also labeled 'Inactive/deleted' in a blue box.

# Primary Clustering

- Formation of large clusters of occupied cells causing expensive insertions
- Keys that hash into any of these large clusters of occupied cells require excessive attempts to resolve collisions

0	199
1	
2	
3	123
4	103
5	674
6	456
7	437
8	617
9	419

Primary cluster,  
example

Input: {337, 123, 617, 519, 456, 674, 199, 103}

# Primary Clustering

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## ■ Case of inserting 505

$$h(505, 10) = 505 \bmod 10 = 5$$

Impossible to insert!  
Search for next available slot!

0	199
1	
2	
3	123
4	674
5	675
6	456
7	437
8	617
9	419

Primary cluster,  
example



# Primary Clustering

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- Items that collide because of identical hash function results in degenerate performance
  - Multiple attempts to find empty cells
  - Cluster increases in size for every collision resolution (insertion)
- Collision with alternative locations for other items cause poor performance

# Load Factor ( $\alpha$ )

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- Number of elements in a hash table divided by the size of the hash table ( $\alpha \in [0,1]$ )
- That is the fraction of the hash table that is full
- The load factor ranges from 0 (empty) to 1(full)
- **Note:** can be greater than 1, we will see this later (separate chaining)

# Expected Number of Probes (Naive Analysis)

- If independence of probes is assumed the average number of cells examined during an insertion using linear probing is  $1/(1-\alpha)$
- A table with load factor of  $\alpha$  has a probability of  $1-\alpha$  of a cell being empty
- Example: in a table of size 10 with 5 slots filled we have a load factor of 0.5 (the number of probing trials is  $1/0.5 = 2$ )

# Expected Number of Probes (Naive Analysis)

- This is based on the fact that if the probability of an event is  $p$  then  $1/p$  trials are needed till it occurs
- But what happens if we have a larger table say of size 100 and a load factor of 0.9
- Naive method indicates only 10 probes!
- Not exactly true because we have to be checking at least 90 slots in the worst case



# Expected Number of Probes (A better estimate)

- A better way of getting an estimate for larger arrays is

$$(1 + 1/(1 - \alpha)^2) / 2$$

- In this case we see that at least 50 trials are needed for an insertion

- Note:

- To avoid primary clustering, use a heuristic to ensure new insertions do not result in a table that is more than half full
- That is the load factor is always  $< 0.5$

# Other Observations...

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- Linear probing searches for a free slot sequentially
- Problematic for large tables with small groupings of clusters scattered arbitrarily (high load factors)
- Can take a long time to find a free slot. Too many markers degrade performance (rehash if necessary)
- Expanding table size to cope with higher load factors is impractical

Index	Value
0	199
1	
2	
3	<b>123</b>
4	674
5	
6	456
7	437
8	617
9	519