

## Objectives

You should be able to...

# Hash Tables

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- Explain the operations of a hash table: insert, find, delete.
- Explain the following collision resolution methods:
  - Chaining
  - Open Addressing
    - Linear Probing
    - Quadratic Probing
    - Double Hashing

## Motivation

- What are the advantages of arrays?
  - They are fast ( $\mathcal{O}(1)$ )—if you know where the data is.
- What are the disadvantages of arrays?
  - They are fixed size, it takes a long time ( $\mathcal{O}(n)$ ) to find something we put into it (unless we sort it), we can only index using an integer.

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# Motivation

- What are the advantages of arrays?
  - They are fast ( $\mathcal{O}(1)$ )—if you know where the data is.
- What are the disadvantages of arrays?
  - They are fixed size, it takes a long time ( $\mathcal{O}(n)$ ) to find something we put into it (unless we sort it), we can only index using an integer.

What we want:  $\mathcal{O}(1)$  access to add and find data, not have to worry about the size, not have to know the location of the data.

## Definition

- A *hash table* is an *array*  $t$  together with a *hashing function*  $h$ .
- The *hash function*  $h(x)$  takes our data  $x$  and converts it into an integer  $i$ .
- Then  $t[i] \leftarrow x$ .
- Remember linear-time sorting? We can tell where the data should go simply by looking at it, no need for comparisons.
- We assume that  $h(x)$  runs quickly ( $\mathcal{O}(1)$ ).
- We'll talk about good hashing functions next time.

## Example

Define a Hash Function

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	6

$i$	$t[i]$
0	
1	
2	
3	apple
4	
5	
6	

Insert apple:  
 $h(\text{apple}) \bmod 7 = 3$

# Example

Define a Hash Function

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	6

$i$	$t[i]$
0	banana
1	
2	
3	apple
4	
5	
6	

Insert banana:  
 $h(\text{banana}) \bmod 7 = 0$

# Example

Define a Hash Function

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	6

$i$	$t[i]$
0	banana
1	
2	
3	apple
4	cherry
5	
6	

Insert cherry:  
 $h(\text{cherry}) \bmod 7 = 4$

# Example

Define a Hash Function

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	6

$i$	$t[i]$
0	banana
1	
2	
3	apple
4	cherry
5	durian
6	

Insert durian:  
 $h(\text{durian}) \bmod 7 = 5$

# Example

Define a Hash Function

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	6

$i$	$t[i]$
0	banana
1	
2	eggplant
3	apple
4	cherry
5	durian
6	

Insert eggplant:  
 $h(\text{eggplant}) \bmod 7 = 2$

## Example

Define a Hash Function

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	6

$i$	$t[i]$
0	banana
1	
2	eggplant
3	apple
4	cherry
5	durian
6	

Insert fig:  
 $h(\text{fig}) \bmod 7 = 3 \dots$  problem....

## Collision Handling

Two things you can do...

There are two things you can do with a collision.

- 1 You can put both values into the same bucket.
- 2 You can put the collided value into a different bucket.

## Separate Chaining

With separate chaining, the buckets are linked lists.

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	5

$i$	$t[i]$
0	banana
1	
2	eggplant
3	fig $\longrightarrow$ apple
4	cherry
5	durian
6	

Insert fig:  
 $h(\text{fig}) \bmod 7 = 3$

## Separate Chaining

With separate chaining, the buckets are linked lists.

$x$	$h(x)$
apple	24
banana	35
cherry	18
durian	75
eggplant	44
fig	52
grape	5

$i$	$t[i]$
0	banana
1	
2	eggplant
3	fig $\longrightarrow$ apple
4	cherry
5	grape $\longrightarrow$ durian
6	

Insert grape:  
 $h(\text{grape}) \bmod 7 = 5$

## Performance of Separate Chaining

- What do you think will happen to the performance of the hash table as more data is inserted?

## Linear Probing

- Linked lists sometimes behave badly with memory: we can't tell from which page the next element will be...
- Solution: put the element in a different, empty section of the hash table.
- Several ways to pick the next element. Linear probing technique: move forward until an empty spot is found. So, if  $t[i = h(x)]$  is full, try  $t[i + 1]$ ,  $t[i + 2]$ , ...

## Linear Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	
3	
4	
5	
6	

Insert apple...

## Linear Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	
3	banana
4	
5	
6	

Insert banana...

# Linear Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	
5	
6	

Insert cherry...

# Linear Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	durian
5	
6	

Insert durian...

# Linear Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	durian
5	eggplant
6	

Insert eggplant...

# Linear Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	durian
5	eggplant
6	fig

Insert fig...

## Primary Clustering

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	durian
5	eggplant
6	fig

Note what happens when “fig” is inserted.

A collision tends to create a *cluster* that will make it more likely for a collision in the future.

## Deletion

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	durian
5	eggplant
6	fig

Deletion must be handled carefully. Suppose we delete “banana” now...

## Deletion

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	
4	durian
5	eggplant
6	fig

Deletion must be handled carefully. Suppose we delete “banana” now... and then try to find “fig”. What happens?

## Deletion

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	X
4	durian
5	eggplant
6	fig

We need to put a placeholder in spots containing deleted elements.

## Quadratic Probing

- Linear probing causes clustering. Perhaps this can be avoided by picking a different collision resolution method.
- Quadratic probing technique: move forward by squares until an empty spot is found. So, if  $t[i = h(x)]$  is full, try  $t[i + 1^2]$ ,  $t[i + 2^2]$ ,  $t[i + 3^2]$ ,...

## Quadratic Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	
3	
4	
5	
6	

Insert apple...

## Quadratic Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	
3	banana
4	
5	
6	

Insert banana...

## Quadratic Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	
5	
6	

Insert cherry...



## Quadratic Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	
5	
6	durian

Insert durian...

## Quadratic Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	eggplant
5	
6	durian

Insert eggplant... no collision this time!

## Quadratic Probing Example

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	eggplant
5	fig
6	durian

Insert fig...

## Secondary Clustering

$x$	$h(x)$
apple	1
banana	3
cherry	1
durian	2
eggplant	4
fig	1

$i$	$t[i]$
0	
1	apple
2	cherry
3	banana
4	eggplant
5	fig
6	durian

Note what happens when “fig” is inserted.

This creates a different kind of clustering pattern, called *secondary clustering*. It only affects collisions that start in the same cell.

## Double Hashing

- With both linear and quadratic probing, we have trouble when an element hashes to an occupied space: the algorithm will always retrace the same path.
- Solution: make each key do something different in the event of a collision. Use a second hash function.
- $i = h_1(x)$ . If  $t[i]$  is full, try  $t[i + h_2(x)]$ ,  $t[i + 2h_2(x)]$ ,  $t[i + 3h_2(x)]$ , ...

## Double Hashing Probing Example

$x$	$h_1(x)$	$h_2(x)$
apple	1	5
banana	3	2
cherry	1	4
durian	2	4
eggplant	4	3
fig	1	3

$i$	$t[i]$
0	
1	apple
2	
3	
4	
5	
6	

Insert apple...

## Double Hashing Probing Example

$x$	$h_1(x)$	$h_2(x)$
apple	1	5
banana	3	2
cherry	1	4
durian	2	4
eggplant	4	3
fig	1	3

$i$	$t[i]$
0	
1	apple
2	
3	banana
4	
5	
6	

Insert banana...

## Double Hashing Probing Example

$x$	$h_1(x)$	$h_2(x)$
apple	1	5
banana	3	2
cherry	1	4
durian	2	4
eggplant	4	3
fig	1	3

$i$	$t[i]$
0	
1	apple
2	
3	banana
4	
5	cherry
6	

Insert cherry...

## Double Hashing Probing Example

$x$	$h_1(x)$	$h_2(x)$
apple	1	5
banana	3	2
cherry	1	4
durian	2	4
eggplant	4	3
fig	1	3

$i$	$t[i]$
0	
1	apple
2	durian
3	banana
4	
5	cherry
6	

Insert durian...

## Double Hashing Probing Example

$x$	$h_1(x)$	$h_2(x)$
apple	1	5
banana	3	2
cherry	1	4
durian	2	4
eggplant	4	3
fig	1	3

$i$	$t[i]$
0	
1	apple
2	durian
3	banana
4	eggplant
5	cherry
6	

Insert eggplant...

## Double Hashing Probing Example

$x$	$h_1(x)$	$h_2(x)$
apple	1	5
banana	3	2
cherry	1	4
durian	2	4
eggplant	4	3
fig	1	3

$i$	$t[i]$
0	fig
1	apple
2	durian
3	banana
4	eggplant
5	cherry
6	

Insert fig...

## Performance

- What would you expect from the performance of a hash table as it becomes full?
- After about 70-80% of the slots have been filled, it is good to resize the array, and rehash all of the elements.
- The deletion markers can be omitted during rehashing.