

COL106 - Data Structures and Algorithms

Minor Revision

Linear Probing

(uses less memory than chaining, but slower)
causes clustering

Example:

$$h(x) = x \bmod 13$$

Insert: 18, 41, 22, 44, 59, 32, 31, 72

$n \bmod 13$

		41			18	44	59	32	22	31	72	
0	1	2	3	4	5	6	7	8	9	10	11	12

Linear Probing

Example:

$$h(x) = x \bmod 13$$

Insert: 18, 41, 22, 44, 59, 32, 31, 73

		41			18	44	59	32	22	31	73	
0	1	2	3	4	5	6	7	8	9	10	11	12

Red arrows point from the value 32 at index 8 to indices 6, 7, and 8, indicating the probing sequence.

Delete 32

0	1	2	3	4	5	6	7	8	9	10	11	12

Linear Probing

Example:

$$h(x) = x \bmod 13$$

Insert: 18, 41, 22, 44, 59, 32, 31, 73

		41			18	44	59		22	31	73	
0	1	2	3	4	5	6	7	8	9	10	11	12

Delete 32

		41			18	44	59	X	22	31	73	74
0	1	2	3	4	5	6	7	8	9	10	11	12

lookup \rightarrow ignore X
insert \rightarrow replace X

- Rehash if there are too many

Double Hashing

Quadratic probing:
 $(h(k) + i^2) \bmod m$

Use two functions: primary hash
secondary hash

$h(k)$
 $d(k)$

- table size (m)
must be prime.

↓
cannot take 0
values.

handles collision
by placing item in
first available cell
in

$(i + j d(k)) \bmod m$
 $j \in \{0, 1, \dots, m-1\}$

DoubleHashInsert(k)

if (table is full) error

probe = $h(k)$; offset = $d(k)$

while (table[probe] occupied)

probe = (probe + offset) mod m

table[probe] = k

Double Hashing Example

$$m = 13$$

$$h(k) = k \bmod 13$$

$$d(k) = 7 - k \bmod 7$$

$h(k)$

Insert: 18, 41, 22, 44, 59, 32, 31, 73

		41			18				22	44		
0	1	2	3	4	5	6	7	8	9	10	11	12

Analysis of Double Hashing

- let α (load factor) be < 1
- Assume every probe looks at a random location in the table
- $1 - \alpha$ fraction of table is empty.
- Expected # probes to find an empty location
$$= \frac{1}{1 - \alpha}$$

required \swarrow for unsuccessful search.

Analysis of Double Hashing

- Average number of probes for a successful search
= Average number of probes required to insert all elements
- To insert an element we need to find an empty location.

$$\{1, \dots, m/2\}$$

$$\leq 2$$

$$m$$

$$\left\{\frac{m}{2}+1, \dots, \frac{m}{2}+\frac{m}{4}\right\}$$

$$\leq 4$$

$$m$$

$$\left\{\frac{m}{2}+\frac{m}{4}+1, \dots, \frac{m}{2}+\frac{m}{4}+\frac{m}{8}\right\}$$

$$\leq 8$$

$$m$$

$$\vdots$$

next $m/2$

$$\leq 2^i$$

$$m$$

Analysis of Double Hashing

- # probes required to insert $\frac{m}{2} + \frac{m}{4} + \dots + \frac{m}{2^i}$ elements
= # probes required to leave $\frac{1}{2^i}$ fraction of table empty
= $m \cdot i$
- # probes required to leave $(1-\alpha)$ fraction of table empty = $m \cdot \log\left(\frac{1}{1-\alpha}\right)$
- Average # probes required to insert n elements
= $\frac{m}{n} \log\left(\frac{1}{1-\alpha}\right) = \frac{1}{\alpha} \log \frac{1}{1-\alpha}$

Chaining vs Probing

→ Assume uniform hashing.

	Unsuccessful	Successful	} on an average
Chaining	$O(1 + \alpha)$	$O(1 + \alpha/2)$	
Probing	$O\left(\frac{1}{1-\alpha}\right)$	$O\left(\frac{1}{\alpha} \ln \frac{1}{1-\alpha}\right)$	

- worst case: $O(n)$ time

- Exercise: Pick a hash fn & come up with a worst-case instance!

Sets, Multisets, Multimap ADTs

← unordered
collection of
elements
without duplicates

↓ set with
duplicates

→ map ADT
where same key
can be mapped to
multiple values.

add(e)
remove(e)
contains(e)
iterator()
union(S, T)
intersection(S, T)
subtraction(S, T)

remove(e, n)
count(e)
size()

get(k)
put(k, v)
remove(k, v)
removeAll(k)
size()
entries()
keys()
values()

java.util.HashSet

- Sorted sets, multisets
& maps

Set = map where
keys don't have values
associated

Recap

Abstract Data Types (ADTs)

① Arrays

② Linked Lists

- Singly linked lists

- Doubly linked lists

③ Stacks (LIFO)

④ Queues (FIFO)

⑤ Trees

⑥ Priority Queues & Heaps

⑦ Hash tables

- collection of objects that we would like to manipulate.
(e.g. sets, lists, ...)

- characterised by operations you can perform on the objects.

- no constraint on how you implement these operations

→ List ADT

Arrays

- Implemented as a contiguous sequence of objects (of a certain type) → in memory

Array ADT: Given set S , $f(S)$ is the set of functions from a finite set of non-negative integers to S .

Operations: Is Empty(), read Index(i), insert(x, i), delete(i)

- Array has a predefined size which cannot be extended.

List ADT: add(i, e), set(i, e), get(i), remove(i) } growable array?
- Can be implemented using Array ADT

Comparing data structures for efficiency

→ Compare algorithms without implementing them

Feature	Array	LinkedList
Space Usage	$O(N)$ – N is the maximum possible size Even in growable arrays there is wasted space	$O(n)$ – number of elements in the list
Given integer position, get the element	$O(1)$ – allows random access	$O(i)$ – for locating an element at integer position i
Inserting an element in the middle (given the position)	$O(n)$ – copy all the subsequent elements	$O(1)$
Deleting an element in the middle (given the position)	$O(n)$ – copy all subsequent elements	$O(1)$

- Asymptotic Analysis
- RAM model
- Program correctness, Loop invariants.

Stacks & Queues

Insertions & deletions are FIFO

- Stores objects
- Insertions & deletions are LIFO

Operations:

push(x)

pop()

top()

size()

- Can be implemented using an array or LL → more expensive in implementation
- $O(1)$ for push & pop

- Max size of stack has to be defined a priori if using array

Applications:

- Browser history
- Function calls & return values
- parentheses matching
- expression evaluation
- HTML parsing
- Convex hull (Graham's scan)

Operations:

- enqueue(x)

add(x)

- dequeue()

remove()

- peek()

first()

poll()

- Can be implemented using array/LL.

Trees Hierarchical data structures

Defns: Nodes, (parent, children, sibling), root, leaf, depth, height,
internal / external ancestors, descendants

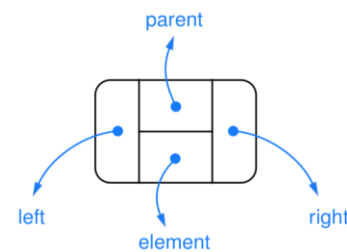
- Recursive defn of a tree
- ordered tree

Implementing Trees

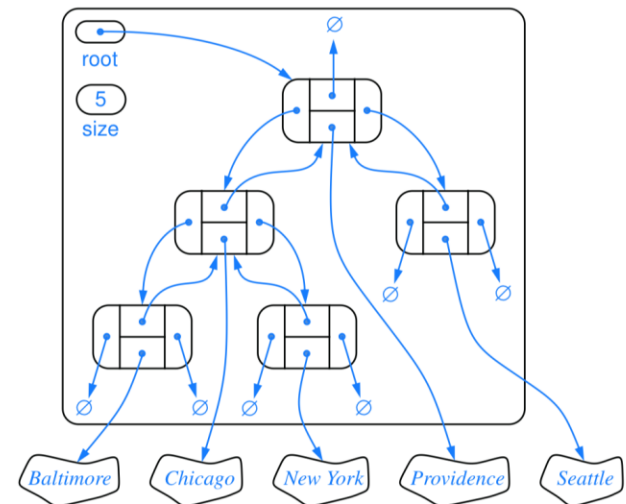
Tree ADT:

root()
parent(p)
children(p)
numchildren(p)
size()
isEmpty()

Is Internal(p)
is External(p)
is Root(p)
positions()
iterator()



(a)



(b)

Tree Traversals

→ Systematic way of visiting all nodes; assuming $O(1)$ work done at each node

Preorder(T): visit $\text{root}(T)$ & recursively trees rooted at children (maintaining order if T is ordered)

PostOrder(T):
- Traverse subtrees rooted at children (maintain order...)
- visit $\text{root}(T)$

Overall running time = $O(n)$

preorder(p):

- visit(p)
- for each $c \in \text{children}(p)$
preorder(c)

post order(p)

- for each $c \in \text{children}(p)$
postorder(c)
- visit(p)

Breadth First Traversal

- visit all nodes at depth d before visiting nodes at depth $d+1$
- Queue nodes at each level.
- Can also be implemented using a stack.

BFS()

$Q \leftarrow$ empty queue

$Q.enqueue(\text{root})$

while Q not empty

$p = Q.dequeue()$:

visit p

for each $c \in \text{children}(p)$

$Q.enqueue(c)$

Binary Trees

ADT:

- $\text{left}(p)$
- $\text{right}(p)$
- $\text{sibling}(p)$

- ordered trees
- each node has ≤ 2 children
(left, right)
- left \leq right (parenthesis representation)
- "proper" binary tree - every node has 0 or 2 children
- can be implemented with an array
- Inorder traversal \rightarrow left subtree \rightarrow root \rightarrow right subtree

Priority Queues & Heaps

need to process elements according to priority

- ① arbitrary element insertion
- ② Removal of element with 1st priority assigned via key (a number)

ADT:

- insert(k, v)
- min()
- removeMin()
- size()
- Is Empty()

→ can be implemented using $\text{if sorted/unsorted}$ but $O(n)$ insert/min time

- Heaps!

- Binary Tree with relational property & structural property
- $O(\log n)$ time for all update operations
- Can be implemented using an array.
- Bonus: Heapsort!