



CSE 373 Analysis of Algorithms  
Fall 2016  
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# LEC03

## ELEMENTARY DATA STRUCTURE (65-77)

Lecture slide courtesy of Prof. Steven Skiena

# PROBLEM OF THE DAY

True or False?

1.  $2n^2 + 1 = O(n^2)$

2.  $\sqrt{n} = O(\log n)$

3.  $\log n = O(\sqrt{n})$

4.  $n^2(1 + \sqrt{n}) = O(n^2 \log n)$

5.  $3n^2 + \sqrt{n} = O(n^2)$

6.  $\sqrt{n} \log n = O(n)$

7.  $\log n = O(n^{-1/2})$

# ELEMENTARY DATA STRUCTURES

- ✗ Elementary data structures such as stacks, queues, lists, and heaps are the “off-the-shelf” components we build our algorithm from.
- ✗ Changing the data structure does not change the correctness of the program. However, it can change the total performance time.
- ✗ There are two aspects to any data structure:
  - + The **abstract operations** which it supports.
  - + The **implementation** of these operations.

# DATA ABSTRACTION

- ✗ That we can describe the behavior of our data structures in terms of abstract operations is why we can use them without thinking.
- ✗ That there are different implementations of the same abstract operations enables us to optimize performance.
- ✗ containers, dictionaries, and priority queues

# CONTIGUOUS VS. LINKED DATA STRUCTURES

- × Data structures can be neatly classified as either *contiguous* or *linked* depending upon whether they are based on arrays or pointers:
  - + Contiguously-allocated structures are composed of *single slabs of memory*
    - × Ex> arrays, matrices, heaps, and hash tables.
  - + Linked data structures are composed of multiple distinct chunks of memory bound together by *pointers*
    - × Ex> lists, trees, and graph adjacency lists.

# ARRAYS

- × An array is a structure of fixed-size data records such that each element can be efficiently located by its *index* or (equivalently) address.
- × Advantages of contiguously-allocated arrays include:
  - + Constant-time access given the index.
  - + Arrays consist purely of data, so no space is wasted with links or other formatting information.
  - + Physical continuity (memory locality) between successive data accesses helps exploit the high-speed cache memory on modern computer architectures.

# DYNAMIC ARRAYS

- ✗ Unfortunately we cannot adjust the size of simple arrays in the middle of a program's execution.
- ✗ Compensating by allocating extremely large arrays can waste a lot of space.
- ✗ With *dynamic arrays* we start with an array of size 1, and double its size from  $m$  to  $2m$  each time we run out of space.
- ✗ How many times will we double for  $n$  elements?
  - + Only  $\text{ceil}(\log_2 n)$ .

## HOW MUCH TOTAL WORK?

- ✗ The apparent waste in this procedure involves the recopying of the old contents on each expansion.
- ✗ If half the elements move once, a quarter of the elements twice, and so on, the total number of movements  $M$  is given by:

$$M = \sum_{i=1}^{\lg n} i * \frac{n}{2^i} = n \sum_{i=1}^{\lg n} \frac{i}{2^i} \leq n \sum_{i=1}^{\infty} \frac{i}{2^i} = 2n$$

- ✗ Thus each of the  $n$  elements move an average of only twice, and the total work of managing the dynamic array is the same  $O(n)$  as a simple array.

$$\sum_{n=0}^{\infty} n a^n = \frac{a}{(1-a)^2} \quad |a| < 1$$

$$\sum_{n=0}^{\infty} a^n = \frac{1}{1-a} \quad |a| < 1$$



# POINTERS AND LINKED STRUCTURES

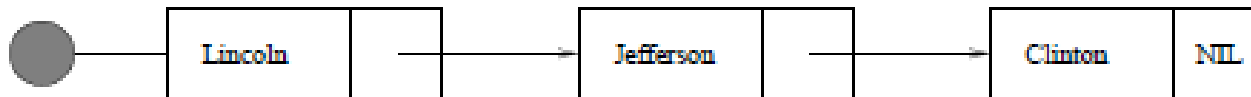
- × **Pointers** represent the address of a location in memory.
- × A cell-phone number can be thought of as a pointer to its owner as they move about the planet.
- × In C, **\*p** denotes the item pointed to by p, and **&x** denotes the address (i.e. pointer) of a particular variable x.
- × A special NULL pointer value is used to denote structure-terminating or unassigned pointers.

# LINKED LIST STRUCTURES

```
typedef struct list {  
    item_type item;  
    struct list *next;  
} list;
```

1. one or more data fields

2. a pointer field  
to at least one  
other node



3. pointer to  
the head of  
the  
structure

# SEARCHING A LIST

- ✗ Searching in a linked list can be done iteratively or recursively.

Recursive implementation: .

```
list *search_list(list *l, item_type x)
{
    if (l == NULL) return(NULL);

    if (l->item == x)
        return(l);
    else
        return( search_list(l->next, x) );
}
```

# INSERTION INTO A LIST

- ✗ Since we have no need to maintain the list in any particular order, we might as well insert each new item at the head.

```
void insert_list(list **l, item_type x)
{
    list *p;

    p = malloc( sizeof(list) );
    p->item = x;
    p->next = *l;
    *l = p;
}
```

- ✗ Note the `**l`, since the head element of the list changes.

## DELETING FROM A LIST - RECURSIVE

```
list *predecessor_list(list *l, item_type x)
{
    if ((l == NULL) || (l->next == NULL)) {
        printf("Error: predecessor sought on null list.\n");
        return(NULL);
    }

    if ((l->next)->item == x)
        return(l);
    else
        return( predecessor_list(l->next, x) );
}
```

1. find a  
pointer to the  
*predecessor* of the  
item to be deleted

2. Reset the pointer to  
the head of the list (l)  
when the first element  
is deleted:

```
delete_list(list **l, item_type x)
{
    list *p;                /* item pointer */
    list *pred;              /* predecessor pointer */
    list *search_list(), *predecessor_list();

    p = search_list(*l,x);
    if (p != NULL) {
        pred = predecessor_list(*l,x);
        if (pred == NULL)    /* splice out out list */
            *l = p->next;
        else
            pred->next = p->next;

        free(p);             /* free memory used by node */
    }
}
```

# ADVANTAGES OF LINKED LISTS

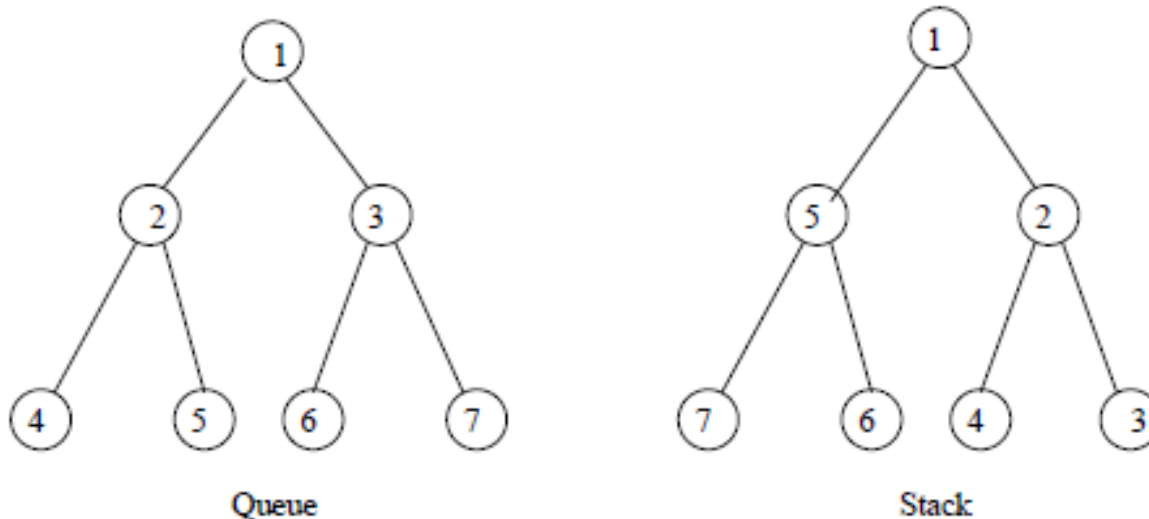
- ✗ The relative advantages of linked lists over static arrays include:
  1. Overflow on linked structures can never occur unless the memory is actually full.
  2. Insertions and deletions are *simpler* than for contiguous (array) lists.
  3. With large records, moving pointers is easier and faster than moving the items themselves.
- ✗ Dynamic memory allocation provides us with flexibility on how and where we use our limited storage resources.

# CONTAINERS: STACKS AND QUEUES

- ✖ Sometimes, the order in which we retrieve data is independent of its content, being only a function of when it arrived. (DS called *Containers*)
- ✖ A **stack** supports last-in, first-out (LIFO) operations:
  - + – Push(x,s): Insert item x at the top of stack s.
  - + – Pop(s): Return (and remove) the top item of stack s.
- ✖ A **queue** supports first-in, first-out (FIFO) operations:
  - + – Enqueue(x,q): Insert item x at the back of queue q.
  - + – Dequeue(q): Return (and remove) the front item from queue q.
- ✖ Lines in banks are based on queues, while food in my refrigerator is treated as a stack.
- ✖ Stacks and queues can be effectively implemented using either arrays or linked lists.

# IMPACT ON TREE TRAVERSAL

- ✗ Both can be used to store nodes to visit in a tree, but the order of traversal is completely different.



- ✗ Which order is friendlier for WWW crawler robots?



# DICTIONARY / DYNAMIC SET OPERATIONS

The *dictionary* data type permits access to data items by content.

Perhaps the most important class of data structures maintain a set of items, indexed by keys.

- ✗  $\text{Search}(S, k)$  – A query that, given a set  $S$  and a key value  $k$ , returns a pointer  $x$  to an element in  $S$  such that  $\text{key}[x] = k$ , or  $\text{nil}$  if no such element belongs to  $S$ .
- ✗  $\text{Insert}(S, x)$  – A modifying operation that augments the set  $S$  with the element  $x$ .
- ✗  $\text{Delete}(S, *x)$  – Given a pointer  $x$  to an element in the set  $S$ , remove  $x$  from  $S$ . Observe we are given a pointer to an element  $x$ , not a key value.

May also have following functions:

- ✖  $Min(S)$ ,  $Max(S)$  – Returns the element of the totally ordered set  $S$  which has the smallest (largest) key.
- ✖  $Next(S, k)$ ,  $Previous(S, k)$  – Retrieve the item from  $D$  whose key is immediately before (or after)  $k$  in sorted order.
- ✖ These enable us to iterate through the elements of the data structure. There are a variety of implementations of these *dictionary* operations, each of which yield different time bounds for various operations.

# ARRAY BASED SETS: UNSORTED ARRAYS

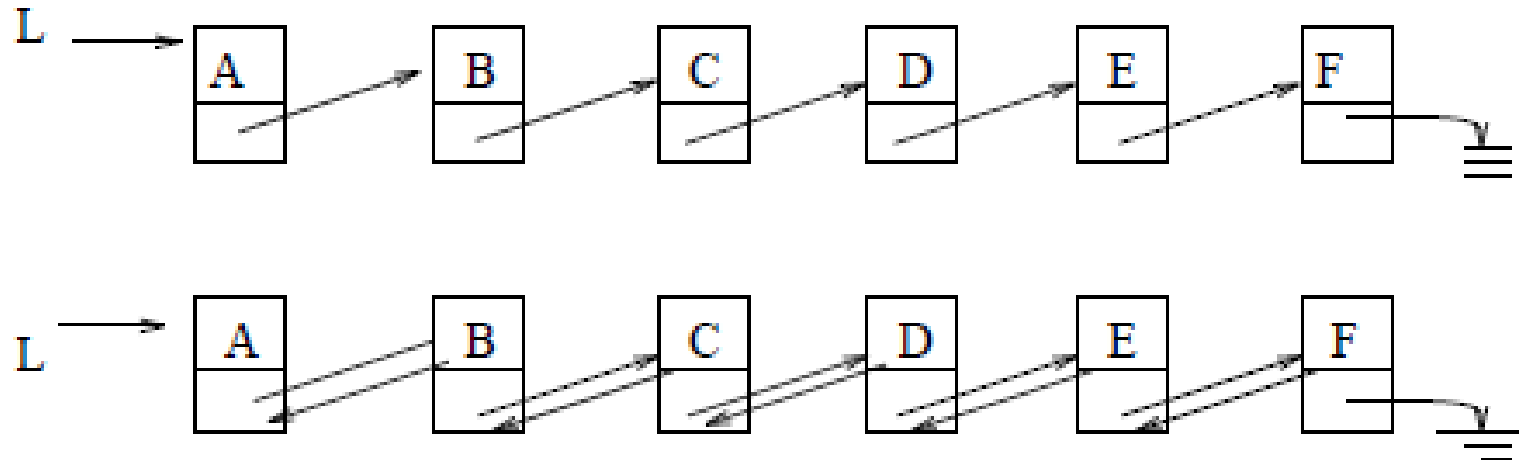
- × Search( $S, k$ ) - sequential search,  $O(n)$
- × Insert( $S, x$ ) - place in first empty spot,  $O(1)$
- × Delete( $S, *x$ ) - copy  $n$ th item to the  $x$ th spot,  $O(1)$
- × Min( $S$ ), Max( $S$ ) - sequential search,  $O(n)$
- × Successor( $S, k$ ), Predecessor( $S, k$ ) - sequential search,  $O(n)$

# ARRAY BASED SETS: SORTED ARRAYS

- × Search( $S, k$ ) - binary search,  $O(\lg n)$
- × Insert( $S, x$ ) - search, then move to make space,  $O(n)$
- × Delete( $S, *x$ ) - move to fill up the hole,  $O(n)$
- × Min( $S$ ), Max( $S$ ) - first or last element,  $O(1)$
- × Successor( $S, k$ ), Predecessor( $S, k$ ) - Add or subtract 1 from pointer,  $O(1)$

# POINTER BASED IMPLEMENTATION

We can maintain a dictionary in either a singly or doubly linked list.



# DOUBLY LINKED LISTS

- ✗ We gain extra flexibility on predecessor queries at a cost of doubling the number of pointers by using doubly-linked lists.
- ✗ Since the extra big-Oh costs of doubly-linked lists is zero, we will usually assume they are, although it might not be necessary.
- ✗ Singly linked to doubly-linked list is as a Conga line is to a Can-Can line.

## STOP AND THINK: COMPARING DICTIONARY IMPLEMENTATIONS

*Problem:* What is the asymptotic worst-case running times for each of the seven fundamental dictionary operations when the data structure is implemented as

- A singly-linked unsorted list.
- A doubly-linked unsorted list.
- A singly-linked sorted list.
- A doubly-linked sorted list.

Dictionary operation	Singly unsorted	Double unsorted	Singly sorted	Doubly sorted
Search( $L, k$ )	$O(n)$	$O(n)$	$O(n)$	$O(n)$
Insert( $L, x$ )	$O(1)$	$O(1)$	$O(n)$	$O(n)$
Delete( $L, x$ )	$O(n)^*$	$O(1)$	$O(n)^*$	$O(1)$
Successor( $L, x$ )	$O(n)$	$O(n)$	$O(1)$	$O(1)$
Predecessor( $L, x$ )	$O(n)$	$O(n)$	$O(n)^*$	$O(1)$
Minimum( $L$ )	$O(n)$	$O(n)$	$O(1)$	$O(1)$
Maximum( $L$ )	$O(n)$	$O(n)$	$O(1)^*$	$O(1)$