# CS 1114: <br> Implementing Search 

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(notes modified from Noah Snavely, Spring 2009)

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## Last time

- Graph traversal

- Two types of todo lists:
- Stacks $\rightarrow$ Depth-first search
- Queues $\rightarrow$ Breadth-first search


## Basic algorithms

## BREADTH-FIRST SEARCH (Graph G)

- While there is an uncoloured node $\mathbf{r}$
- Choose a new colour
- Create an empty queue $\mathbf{Q}$
- Let $\mathbf{r}$ be the root node, colour it, and add it to $\mathbf{Q}$
- While $\mathbf{Q}$ is not empty
- Dequeue a node $\mathbf{v}$ from $\mathbf{Q}$
- For each of $\mathbf{v}$ 's neighbors $\mathbf{u}$
- If $\mathbf{u}$ is not coloured, colour it and add it to $\mathbf{Q}$


## Basic algorithms

## DEPTH-FIRST SEARCH (Graph G)

While there is an uncoloured node $\mathbf{r}$

- Choose a new colour
- Create an empty stack $\mathbf{S}$
- Let $\mathbf{r}$ be the root node, colour it, and push it on $\mathbf{S}$
- While $\mathbf{S}$ is not empty
- Pop a node $\mathbf{v}$ from $\mathbf{S}$
- For each of $\mathbf{v}$ 's neighbors $\mathbf{u}$
- If $\mathbf{u}$ is not coloured, colour it and push it onto $\mathbf{S}$


## Queues and Stacks

- Examples of Abstract Data Types (ADTs)
- ADTs fulfill a contract:
- The contract tells you what the ADT can do, and what the behavior is
- For instance, with a stack:
- We can push and pop
- If we push $X$ onto $S$ and then pop $S$, we get back X , and S is as before
- Doesn' t tell you how it fulfills the contract - This is a really important technique!!!!


## Implementing DFS

- How can we implement a stack?
- Needs to support several operations:
- Push (add an element to the top)
- Pop (remove the element from the top)
- IsEmpty



## Implementing a stack

- IsEmpty
function e = IsEmpty(S)

$$
\mathrm{e}=(\text { length }(\mathrm{S})==0) ;
$$

- Push (add an element to the top)
function $S=\operatorname{push}(S, x)$ $S=\left[\begin{array}{ll}S & x\end{array}\right] \quad \%$ appends $x$ to the end of the array $S$
- Pop (remove an element from the top)
function $[S, x]=\operatorname{pop}(S)$
$\mathrm{n}=$ length(S); $\mathrm{x}=\mathrm{S}(\mathrm{n}) ; \mathrm{S}=\mathrm{S}(1: \mathrm{n}-1) ; \%$ abbreviates S \% but what happens if $\mathrm{n}=0$ ?


## Implementing BFS

- How can we implement a queue?
- Needs to support several operations:
- Enqueue (add an element to back)
- Dequeue (remove an element from front)
- IsEmpty



## Implementing a queue: Take 1

- First approach: use an array
- Add (enqueue) new elements to the end of the array
- When removing an element (dequeue), shift the entire array left one unit

$$
Q=[] ;
$$

## Implementing a queue: Take 1

- IsEmpty
function e = IsEmpty $(\mathrm{Q})$

$$
\mathrm{e}=(\text { length }(\mathrm{S})==0)
$$

- Enqueue (add an element) function $\mathrm{Q}=$ enqueue $(\mathrm{Q}, \mathrm{x})$

$$
\mathrm{Q}=\left[\begin{array}{lll}
\mathrm{Q} & \mathrm{x}
\end{array}\right] ;
$$


$Q(i)=Q(i+1) ; \%$ everyone steps forward one step

## What is the running time?

- IsEmpty
- Enqueue (add an element)
- Dequeue (remove an element)


## Efficiency



- Ideally, all of the operations (push, pop, enqueue, dequeue, IsEmpty) run in constant (O(1)) time
- To figure out running time, we need a model of how the computer's memory works


## Computers and arrays

- Computer memory is a large array
- We will call it M
- In constant time, a computer can:
- Read any element of M (random access)
- Change any element of $M$ to another element
- Perform any simple arithmetic operation
- This is more or less what the hardware manual for an x86 describes


## Computers and arrays

- Arrays in Matlab are consecutive subsequences of $M$



## Memory manipulation

- How long does it take to:
- Read A(8)?
- Set $A(7)=A(8)$ ?
- Copy all the elements of an array (of size n) A to a new part of M ?
- Shift all the elements of $A$ one cell to the left?


## Implementing a queue: Take 2

- Second approach: use an array AND
- Keep two pointers for the front and back of the queue

- Add new elements to the back of the array
- Take old elements off the front of the array

$$
\begin{aligned}
& Q=\text { zeros }(1000000) ; \\
& \text { front }=1 \text {; back }=1 \text {; }
\end{aligned}
$$

# Implementing a queue: Take 2 <br> - IsEmpty 

- Enqueue (add an element)
" Dequeue (remove an element)


## Implementing a queue: Take 3 <br> - Linked lists -

- Alternative to an array
- Every element (cell) has two parts:

1. A value (as in an array)
2. A link to the next cell

## Linked lists



## Linked lists as memory arrays

M


- We' II implement linked lists using M
- A cell will be represented by a pair of adjacent array entries


## A few details

- I will draw odd numbered entries in blue and even ones in red
- Odd entries are values
- Number interpreted as list elements
- Even ones are links
- Number interpreted as index of the next cell
- AKA location, address, or pointer
- The first cell is $M(1)$ and $M(2)$ (for now)
- The last cell has 0, i.e. pointer to M(0)
- Also called a "null pointer"


## Example



## Traversing a linked list

- Start at the first cell, [M(1) ,M(2)]
- Access the first value, m(1)
- The next cell is at location $c=m(2)$
- If c = 0, we' re done
- Otherwise, access the next value, m(c)
- The next cell is at location $\mathbf{c}=\mathbf{m}(\mathrm{c}+1)$
- Keep going until c = 0


## Inserting an element - arrays

- How can we insert an element x into an array A?
- Depends where it needs to go:
- End of the array:

$$
A=\left[\begin{array}{ll}
A & x
\end{array}\right] ;
$$

- Middle of the array (say, between elements A (5) and $A(6))$ ?
- Beginning of the array?


## Inserting an element - linked lists

- Create a new cell and splice it into the list

- Splicing depends on where the cell goes:
- How do we insert:
- At the end?
- In the middle?
- At the beginning?


## Adding a header

- We can represent the linked list just by the initial cell, but this is problematic
- Problem with inserting at the beginning
- Instead, we add a header - a few entries that are not cells, but hold information about the list
1.A pointer to the first element
2.A count of the number of elements


## Example



## Linked list insertion

Initial list

| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 5 | 2 | 2 | 0 | 1 | 3 | X | X | X | X | X | X | X |

First element

$$
\text { starts at } 5
$$

Insert a 5 at end

| 5 | 3 | 2 | 7 | 1 | 3 | 5 | 0 | $X$ | $X$ | $X$ | $X$ | $X$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |




## Linked list deletion

- We can also delete cells
- Simply update the header and change one pointer (to skip over the deleted element)
- Deleting things is the source of many bugs in computer programs
- You need to make sure you delete something once, and only once


## Linked list deletion

Initial list

| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |


|  | 1 | 2 | 3 | 4 | 4 | 5 | 6 | 7 | 8 | , | 10 | 11 | 12 | 13 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Delete the last cell | 5 | 3 | 2 | 0 | 0 | 1 | 9 | 5 | 0 | 8 | 3 | X | X | X | X |

Delete the 8

| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 5 | $\mathbf{2}$ | 2 | 0 | 1 | 3 | 5 | 0 | 8 | 3 | X | X | X |


|  | 1 | 2 | 3 |  | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Delete the first cell | 3 | 1 | 2 |  | 0 | 1 | 3 | 5 | 0 | 8 | 3 | X | X | X | X |

## Linked lists - running time

- We can insert an item (at the front) in constant (O(1)) time
- Just manipulating the pointers
- As long as we know where to allocate the cell
- If we need to insert an item inside the list, then we must first find the place to put it.
- We can delete an element (at the front) in constant time
- If the element isn't at the front, then we have to find it ... how long does that take?


## Linked lists - running time

- What about inserting / deleting from the end of the list?
- How long does it take to get there?

