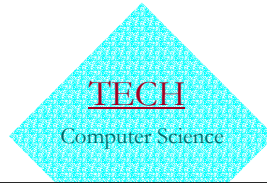


Recursion and Induction

- For advanced algorithm development, recursion is an essential design technique
- Recursive Procedures
- What is a Proof?
- Induction Proofs
- Proving Correctness of Procedures
- Recurrence Equations
- Recursion Trees



Recurrence Equations vs. Recursive Procedures

- Recurrence Equations:
 - defines a function over the natural numbers, say $T(n)$, in terms of its own value at one or more integers smaller than n .
 - $T(n)$ is defined inductively.
 - There are base cases to be defined separately.
 - Recurrence equation applies for n larger than the base cases
- Recursive Procedures:
 - a procedure calls a *unique* copy of itself
 - converging to a base case (stopping the recursion)

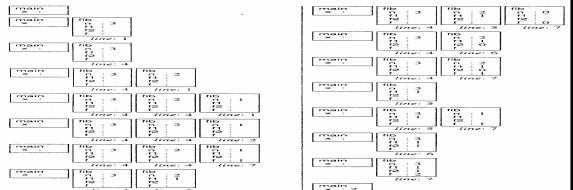
e.g. Fibonacci Function

- Recurrence Equation: e.g. Fibonacci Function
 - $\text{fib}(0) = 0; \text{fib}(1) = 1; //$ base cases
 - $\text{fib}(n) = \text{fib}(n-1) + \text{fib}(n-2) //$ all $n > 2$
- Recursive Procedure:


```
int fib(int n)
    → int f1, f2;
    → 1. if (n < 2)
    → 2. f = n; // base cases
    → 3. else
    → 4. f1 = fib( n-1 );
    → 5. f2 = fib( n-2 );
    → 6. f = f1 + f2;
    → 7. return f;
```

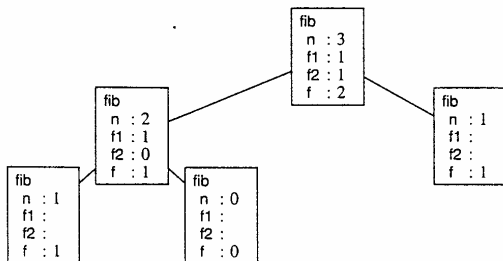
The working of recursive procedure

- a unique copy for each call to itself
 - individual procedure invocation at run time
 - i.e. activation frame
- e.g. The working of $\text{fib}(n)$
 - $\text{main}()$
 - $\text{int } x = \text{fib}(3);$



Activation Tree

- Each node corresponds to a different procedure invocation, just at the point when it is about to return.
- A preorder traversal visits each activation frame in order of its creation



Analysis for algorithm without loops

- In a computation without loops, but possible with recursive procedure calls:
 - The time that any particular activation frame is on the top of the frame stack is $O(L)$,
 - where L is the number of lines in the procedure that contain either a simple statement or a procedure call.
- The total computation time is $\theta(C)$,
- where C is the total number of procedure calls that occur during the computation.

Designing Recursive Procedures

- // Think Inductively
- converging to a base case (stopping the recursion)
 - identify some unit of measure (running variable)
 - identify base cases
- assume p solves all sizes 0 through 100
 - assume p99 solve sub-problem all sizes 0 through 99
 - if p detect a case that is not base case it calls p99
- p99 satisfies:
 - 1. The sub-problem size is less than p's problem size
 - 2. The sub-problem size is not below the base case
 - 3. The sub-problem satisfies all other preconditions of p99 (which are the same as the preconditions of p)

Recursive Procedure design e.g.

- Problem:
 - write a delete(L, x) procedure for a list L
 - which is supposed to delete the first occurrence of x.
 - Possibly x does not occur in L.
- Strategy:
 - Use recursive Procedure
 - The size of the problem is the number of elements in list L
 - Use IntList ADT
 - Base cases: ??
 - Running variable (converging number): ??

ADT for IntList

- IntList cons(int newElement, IntList oldList)
 - Precondition: None.
 - Postconditions: If $x = \text{cons}(\text{newElement}, \text{oldList})$ then
 1. x refers to a newly created object;
 2. $x \neq \text{nil}$;
 3. $\text{first}(x) = \text{newElement}$;
 4. $\text{rest}(x) = \text{oldList}$
- int first(IntList aList) // access function
 - Precondition: aList != nil
- IntList rest(IntList aList) // access function
 - Precondition: aList != nil
- IntList nil //constant denoting the empty list.

Recurrence Equation for delete(L, x) from list L

- Think Inductively
- $\text{delete}(\text{nil}, x) = \text{nil}$
- $\text{delete}(L, x) = \text{rest}(L) /; x \neq \text{first}(L)$
- $\text{delete}(L, x) = \text{cons}(\text{first}(L), \text{delete}(\text{rest}(L), x))$

Algorithm for Recursive delete(L, x) from list

```
//
IntList delete(IntList L, int x)
  IntList newL, fixedL;
  if (L == nil)
    newL = L;
  else if (x == first(L))
    newL = rest(L);
  else
    fixedL = delete99(rest(L), x);
    newL = cons(first(L), fixedL);
  return newL;
```

Algorithm for non-recursive delete(L, x)

```
IntList delete(IntList L, int x)
  IntList newL, tempL;
  tempL = L; newL = nil;
  while (tempL != nil && x != first(tempL)) //copy elements
    newL = cons(first(tempL), newL);
    tempL = rest(tempL)
  If (tempL != nil) // x == first(tempL)
    tempL = rest(tempL) // remove x
  while (tempL != nil) // copy the rest elements
    newL = cons(first(tempL), newL);
    tempL = rest(tempL)
  return newL;
```

Convert a non-recursive procedure to a recursive procedure

- Convert procedure with loop
 - to recursive procedure without loop
- Recursive Procedure acting like WHILE loop
 - While(Not Base Case)
 - Setting up Sub-problem
 - Recursive call to continue
- The recursive function may need an additional parameter
 - which replaces an *index* in a FOR loop of the non-recursive procedure.

Transforming loop into a recursive procedure

- Local variable with the loop body
 - give the variable only one value in any one pass
 - for variable that must be updated, do all the updates at the end of the loop body
- Re-expressing a while loop with recursion
 - Additional parameters
 - > Variables updated in the loop become procedure input parameters. Their *initial values* at loop entry correspond to the actual parameters in the top-level call of the recursive procedure.
 - > Variables referenced in the loop but not updated may also become parameters
 - The recursive procedure begins by mimicking the while condition and returns if while condition is false
 - > a break also corresponds to a procedure return
 - Continue by updating variable and make recursive call

Removing While loop, e.g.

- | | |
|-----------------------|------------------------------------|
| • int factLoop(int n) | • int factLoop(int n) |
| • int k=1; int f = 1 | • return factRec(n, 1, 1); |
| | • int factRec(int n, int k, int f) |
| • while (k <= n) | • if (k <= n) |
| • int fnew = f*k; | • int fnew = f*k; |
| • int knew = k+1 | • int knew = k+1 |
| • k = knew; f = fnew; | • return factRec(n, knew, fnew) |
| • return f; | • return f; |

Removing For loop, e.g.

- Convert the following seqSearch
 - to recursive procedure without loop
- int seqSearch(int[] E, int num, int K)
- 1. int ans, index;
- 2. ans = -1; // Assume failure.
- 3. for (index = 0; index < num; index++)
- 4. if (K == E[index])
- 5. ans = index; // Success!
- 6. break; // Done!
- 7. return ans;

Recursive Procedure without loops e.g.

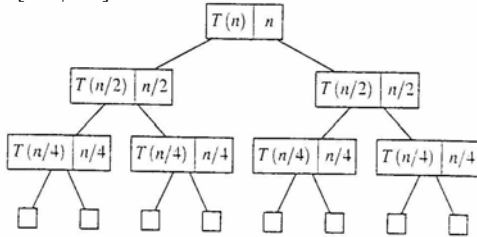
- Call with: seqSearchRec(E, 0, num, K)
- seqSearchRec(E, index, num, K)
 - 1: if (index >= num)
 - 2: ans = -1;
 - 3: else if (E[index] == K) // index < num
 - 4: ans = index;
 - 5: else
 - 6: ans = seqSearchRec(E, index+1, num, K);
 - 7: return ans;
- Compare to: for (index = 0; index < num; index++)

Analyzing Recursive Procedure using Recurrence Equations

- Let n be the size of the problem
- Worst-Case Analysis (for procedure with no loops)
- $T(n) =$
 - the individual cost for a sequence of blocks
 - add the maximum cost for an alternation of blocks
 - add the cost of subroutine call, $S(f(n))$
 - add the cost of recursive procedure call, $T(g(n))$
- e.g. seqSearchRec,
 - Basic operation is comparison of array element, cost 1
 - statement: 1: + max(2:, (3: + max(4:, (5: + 6:))) + (7:))
 - Cost: 0 + max(0, (1 + max(0, (0+T(n-1)))) + 0
- $T(n) = T(n-1) + 1; T(0) = 0$
- $\Rightarrow T(n) = n; T(n) \in \theta(n)$

Evaluate recursive equation using Recursion Tree

- Evaluate: $T(n) = T(n/2) + T(n/2) + n$
 - Work copy: $T(k) = T(k/2) + T(k/2) + k$
 - For $k=n/2$, $T(n/2) = T(n/4) + T(n/4) + (n/2)$
- [size|cost]



Recursion Tree e.g.

- To evaluate the total cost of the recursion tree
 - sum all the non-recursive costs of all nodes
 - = Sum (rowSum(cost of all nodes at the same depth))
- Determine the maximum depth of the recursion tree:
 - For our example, at tree depth d the size parameter is $n/(2^d)$
 - the size parameter converging to base case, i.e. case 1
 - such that, $n/(2^d) = 1$,
 - $d = \lg(n)$
 - The rowSum for each row is n
- Therefore, the total cost, $T(n) = n \lg(n)$

Proving Correctness of Procedures: Proof

- What is a Proof?
 - A Proof is a *sequence* of statements that form a logical argument.
 - Each statement is a complete sentence in the normal grammatical sense.
- Each statement should draw a new conclusion *from*:
 - *axiom*: well known facts
 - *assumptions*: premises of the theorem you are proving or inductive hypothesis
 - *intermediate conclusions*: statements established earlier
- To arrive at the last statement of a proof that must be the conclusion of the proposition being proven

Format of Theorem, Proof Format

- A proposition (theorem, lemma, and corollary) is represented as:
 - $\forall x \in W (A(x) \Rightarrow C(x))$
 - for all x in W , if $A(x)$ then $C(x)$
 - the set W is called world,
 - $A(x)$ represents the *assumptions*
 - $C(x)$ represents the *conclusion*, the goal statement
 - \Rightarrow is read as “implies”
- Proof sketches provides outline of a proof
 - the *strategy*, the *road map*, or the *plan*.
- Two-Column Proof Format
 - **Statement : Justification (supporting facts)**

Induction Proofs

- Induction proofs are a mechanism, often the only mechanism, for proving a statement about an infinite set of objects.
 - **Inferring a property of a set based on the property of its objects**
- Induction is often done *over* the set of natural numbers $\{0, 1, 2, \dots\}$
 - starting from 0, then 1, then 2, and so on
- Induction is valid over a set, provided that:
 - **The set is partially ordered;**
 - i.e. an order relationship is defined between some pairs of elements, but perhaps not between all pairs.
 - **There is no infinite chain of decreasing elements in the set.** (e.g. cannot be set of all integers)

Induction Proof Schema

- 0: Prove: $\forall x \in W (A(x) \Rightarrow C(x))$
- Proof:
 - 1: The Proof is by induction on x , <description of x >
 - 2: The base case is, cases are, <base-case>
 - 3: <Proof of goal statement with base-case substituted into it, that is, $C(\text{base-case})$ >
 - 4: For < x > greater than <base-case>, assume that $A(y) \Rightarrow C(y)$ holds for all $y \in W$ such that $y < x$.
 - 5: <Proof of the goal statement, $C(x)$, exactly as it appears in the proposition>.

Induction Proof e.g.

- Prove:
For all $n \geq 0$,
$$\sum_{i=0}^n i(i+1)/2 = n(n+1)(n+2)/6$$
- Proof: ...

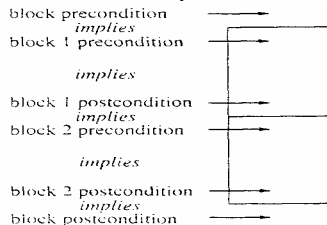
Proving Correctness of Procedures

- Things should be made as simple as possible – but not simpler
→ Albert Einstein
- Proving Correctness of procedures is a difficult task in general; the trick is to make it as simple as possible.
→ No loops is allowed in the procedure!
→ Variable is assigned a value only once!
- Loops are converted into Recursive procedures.
- Additional variables are used to make single-assignment (write-once read many) possible.
→ $x = y+1$ does imply the equation $x = y+1$ for entire time

General Correctness Lemma

- If all *preconditions* hold when the block is entered,
→ then all *postconditions* hold when the block exits
- And, the procedure will terminate!

→ Chains of Inference: Sequence



Proving Correctness of Binary Search, e.g.

- `int binarySearch(int[] E, int first, int last, int K)`
- 1. `if (last < first)`
- 2. `index = -1;`
- 3. `else`
- 4. `int mid = (first + last)/2`
- 5. `if (K == E[mid])`
- 6. `index = mid;`
- 7. `else if (K < E[mid])`
- 8. `index = binarySearch(E, first, mid-1, K)`
- 9. `else`
- 10. `index = binarySearch(E, mid+1, last, K);`
- 11. `return index`

Proving Correctness of Binary Search

- Lemma (*preconditions* \Rightarrow *postconditions*)
→ if `binarySearch(E, first, last, K)` is called, and the problem size is $n = (\text{last} - \text{first} + 1)$, for all $n \geq 0$, and $E[\text{first}], \dots, E[\text{last}]$ are in nondecreasing order,
→ then it returns -1 if K does not occur in E within the range `first, ..., last`, and it returns `index` such that $K = E[\text{index}]$ otherwise
- Proof
→ The proof is by induction on n , the problem size.
→ The base case in $n = 0$.
→ In this case, line 1 is true, line 2 is reached, and -1 is returned. (*the postcondition is true*)

Inductive Proof, continue

- For $n > 0$, assume that `binarySearch(E, first, last, K)` satisfies the lemma on problems of size k , such that $0 \leq k < n$, and `first` and `last` are any indexes such that $k = \text{last} - \text{first} + 1$
→ For $n > 0$, line 1 is false, ... `mid` is within the search range ($\text{first} \leq \text{mid} \leq \text{last}$).
If line 5 is true, the procedure *terminates* with `index = mid`. (*the postcondition is true*)
→ If line 5 is false, from $(\text{first} \leq \text{mid} \leq \text{last})$ and def. of n ,
 $(\text{mid} - 1) - \text{first} + 1 \leq (n - 1)$
 $\text{last} - (\text{mid} + 1) + 1 \leq (n - 1)$
→ so the inductive hypothesis applies for both recursive calls,
→ If line 7 is true, ... the preconditions of `binarySearch` are satisfied, we can assume that the call accomplishes the objective.
→ If line 8 return positive index, done.
→ If line 8 returns -1 , this implies that K is not in E in the first ... `mid-1`, also since line 7 is true, K is not in E in range `min... last`, so returning -1 is correct (done).
→ If line 7 is false, ... similar the postconditions are true. (done!)