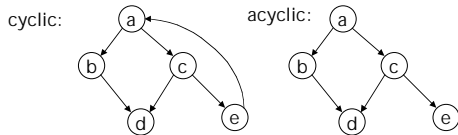


Another Function Decomposition Example (which might use anonymous functions)

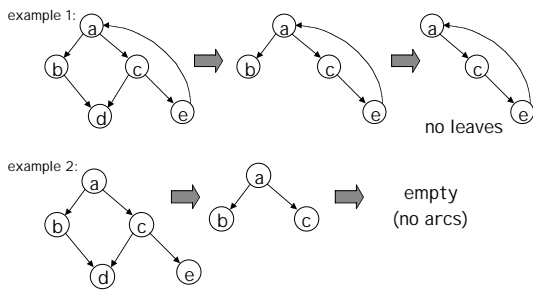
- Construct a function that will tell whether a directed graph, represented as a list of arcs, is acyclic.



"Pruning" Method

- Rosalind B. Marimont
A new method of checking the consistency of precedence matrices
Journal of the ACM 6, 164-171, 1959
- Pruning away any arcs that point to leaves does not change the cyclic/acyclic nature of the graph.
- Pruning such arcs may produce additional leaves.
- Prune until no further pruning is possible:
 - If the result is empty, the original graph was acyclic.
 - If not, it was cyclic.

Examples of Pruning (leaves shown in green)

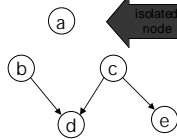


Pruning with Graphs as Lists

- Example 1:
 - `[[a, b], [a, c], [b, d], [c, d], [c, e], [e, a]]` →
 - `[[a, b], [a, c], [c, e], [e, a]]` →
 - `[[a, c], [c, e], [e, a]]` (no leaves)
- Example 2:
 - `[[a, b], [a, c], [b, d], [c, d], [c, e]]` →
 - `[[a, b], [a, c]]` →
 - `[]`

Note

- We are assuming that every node in the graph is on one or the other end of an arc, i.e. there are no isolated nodes, as in the graph below.
- Otherwise, we'd have to represent the graph with two lists: one of nodes and one of arcs.



Functional Code

- Basic idea:
 - As long as there is a leaf:
Remove leaves and their attached arcs
- Translation:

```
isAcyclic(Graph) =
  null(iterate(removeLeaves, hasLeaf, Graph));
```

Annotations for the code above:

- `test for empty list` points to `removeLeaves`
- `iterate first arg. as long as second arg. true` points to `iterate`
- `remove all leaves and their arcs` points to `removeLeaves`
- `test whether there is a leaf` points to `hasLeaf`
- `starting graph` points to `Graph`

hasLeaf

- A Graph has a leaf iff isLeaf is true for one of its nodes.
- `hasLeaf(Graph) =`
`some((Node=>isLeaf(Node, Graph), nodes(Graph)));`

test whether
first arg. is true
for some element of
second arg.

true when Node is
a leaf of this Graph

list of nodes of Graph

isLeaf

- A node is a leaf if it is not the first of any arc in the graph.
- `isLeaf(Node, Graph) =`
`!member(Node, map(first, Graph));`

'not' operator

all nodes of Graph that begin some arc

nodes(Graph)

- `nodes(Graph) =`
`remove_duplicates(append(map(first, Graph),
map(second, Graph)));`
- remembering our assumption: that every node in the graph is on one or the other end of an arc, i.e. there are no isolated nodes, as in the graph below.

remove_leaves

- To remove the leaves:
remove any arc that points to a leaf
- `removeLeaves(Graph) =`
`drop((Arc=>isLeaf(second(Arc), Graph),
Graph);`

the list of arcs in the graph

the node to which Arc points

iterate

- `iterate(action, continue, State) =`
`continue(State) ?`
`iterate(action, continue, action(State))`
`: State;`

conditional expression (as in C++, Java)
`P ? A : B`

means if P is true then the value of the expression is A;
otherwise it is B.

Low-Level Functional Programming

What's "Low-Level" About This?

- "low-level" refers to the construction of functions by explicitly composing and decomposing lists.
- Previously we used higher-order functions to do most of the non-trivial work in a functional decomposition.
- Now we are going to use pattern matching rules, recursion, etc.

Fundamental List Dichotomy

- A list is either:
 - **empty**, `[]` or
 - **non-empty**, in which case it has both a
 - first
 - rest
- Most list definitions deal with these cases separately.
- Definitions are typically a form of **inductive definition**, in which `[]` is the basis.

List Decomposition Notation

- When a list is non-empty, it has a first element and the rest of the elements form a list.
- The general **form** of a **non-empty list** will be represented:

$$[F | R]$$

Here **F** is a variable represents the first element, and **R** is a variable representing the rest of the elements (**R** has a list as its value, even though brackets aren't around R).

List Decomposition Example

- Consider a defining equation:

$$[F | R] = [1, 2, 3, 4]$$

F is a variable represents the first element, so:

$$F == 1$$

R is a variable representing the rest of the elements, so:

$$R == [2, 3, 4]$$

List Decomposition Clarified

- A defining equation:

$$[F | R] = \text{some list}$$

can only be valid when the RHS list is non-empty.

Thus

$$[F | R] = [] \text{ can never be a valid equation.}$$

Defining Functions by Rules

- Suppose we want to define a function taking an arbitrary list as an argument.
- It is sufficient to:
 - define the function on the empty list, and
 - define the function on a general non-empty list.

← called the "basis"

← called the "induction step" or "recursion"

Example

- Define the function **halve_all**, which divides every element in a list by 2.
 - `halve_all([]) => []`;
 - `halve_all([F | R]) => [F/2 | halve_all(R)]`;
- This can be read:
 - "halving all of the empty list is the empty list."
 - "halving all of a non-empty list is half of the first element **followed by** halving all of the rest."

Computation by "Rewriting"

- `halve_all([2, 4, 6])` →
- `[1 | halve_all([4, 6])]` →
- `[1 | [2 | halve_all([6])]]` →
- `[1 | [2 | [3 | halve_all([])]]]` →
- `[1 | [2 | [3 | []]]]` ==
- `[1 | [2 | [3]]]` ==
- `[1 | [2, 3]]` ==
- `[1, 2, 3]`

Extended Notation for Greater Readability

- The first so-many, rather than just the first, element, can be shown separated by commas:
 - `[a, b, c, d | R]` means a list with at least 4 elements, a, b, c, d, followed by the elements in list R (which could be empty).
- In the extended notation:
 - `halve_all([2, 4, 6])` →
 - `[1 | halve_all([4, 6])]` →
 - `[1, 2 | halve_all([6])]` →
 - `[1, 2, 3 | halve_all([])]` →
 - `[1, 2, 3]`

A Way of Remembering

- The combination
| [...]
inside a list "melts away" into
...
unless ... is empty, then it just melts away
- Examples:
 - `[1 | [2, 3, 4]]` == `[1, 2, 3, 4]`
 - `[1, 2 | [3, 4]]` == `[1, 2, 3, 4]`
 - `[1, 2, 3 | [4]]` == `[1, 2, 3, 4]`
 - `[1, 2, 3, 4 | []]` == `[1, 2, 3, 4]`

Alternate

- Of course, we could have just used *map* in this particular case:
 - `halve(A) = A/2`;
 - `halve_all(X) = map(halve, X)`;
- Use higher order functions such as *map* when possible; resort to lower-order ones when you think you need to.
- Higher-order functions can often tell the story more succinctly.

Example

- Define the function **member** which tests whether the first argument is an element of the list in the second argument.
 - `member(X, []) => 0`;
 - `member(X, [F | R]) =>`
 $(X == F) ? 1 : \text{member}(X, R)$;
conditional expression (as in C++, Java)

Alternate

- Instead of using a conditional expression, use a third rule with **pattern matching**:

- `member(X, []) => 0;`
- `member(X, [X| R]) => 1;`
- `member(X, [F| R]) => member(X, R);`

Note: X's must match

- The rule used is always the **first** (from top to bottom) applicable one.

Rule Matching

- Consider evaluating
 - `member(3, [1, 2, 3, 4])` → rule 3 is the first to apply
 - `member(3, [2, 3, 4])` → rule 3 is the first to apply
 - `member(3, [3, 4])` → rule 2 is the first to apply
 - 1

```
member(X, [ ]) => 0; // rule 1
member(X, [X| R]) => 1; // rule 2
member(X, [F| R]) => member(X, R); // rule 3
```

Rule Matching

- Consider evaluating
 - `member(5, [1, 2, 3])` → rule 3 is the first to apply
 - `member(5, [2, 3])` → rule 3 is the first to apply
 - `member(5, [3])` → rule 3 is the first to apply
 - `member(5, [])` → rule 1 is the first to apply
 - 0

Second Alternate (less desirable)

- Use a **conditional guard**:
 - `member(X, []) => 0;`
 - `member(X, [F| R]) => (X == F) ? 1;`
conditional guard
 - `member(X, [F| R]) => member(X, R);`
- The condition is tested after any other matching is applied.
- If the condition fails, then subsequent rules are tried.

Matching with Two or More List Arguments

- Some functions have more than one list argument.
- Induction might, or might not, use rules that dichotomize both lists.

Example: List Equality First Rule

- Two lists are equal if they both are empty:
`equals([], []) => 1;`

List Equality: Second Rule

- Two lists are equal if they are both non-empty and
 - the first elements of each are the same, and
 - the lists of the rest of the elements of each are equal.

$\text{equals}([A \mid L], [A \mid M]) \Rightarrow \text{equals}(L, M)$;

List Equality: Third Rule

- Otherwise, the two lists are not equal:
 $\text{equals}(X, Y) \Rightarrow 0$;

Summary of Equality Rules

- 1 $\text{equals}([], []) \Rightarrow 1$;
- 2 $\text{equals}([A \mid L], [A \mid M]) \Rightarrow \text{equals}(L, M)$;
- 3 $\text{equals}(X, Y) \Rightarrow 0$;

Example of List Equality

- Revisit our earlier example:
 - Are these lists equal:
[1, 2, 3] vs. [1, 2] ?
- Try the rules:
 - $\text{equals}([1, 2, 3], [1, 2]) \Rightarrow$ (rule 2)
 - $\text{equals}([2, 3], [2]) \Rightarrow$ (rule 2)
 - $\text{equals}([3], []) \Rightarrow$ (rule 3)
 - 0
 - i.e. the lists are not equal.

Example: Low-Level Version of Nim *magic*

- Recall:
 $\text{magic}(L, s)$ = a new list similar to L , except that the **first** element, p , where $\text{xor}(p, s) < p$, is **replaced** with $\text{xor}(p, s)$.
- Translation to rules:
 - $\text{magic}([], s) \Rightarrow []$;
 - $\text{magic}([p \mid R], s) \Rightarrow \text{xor}(p, s) < p ? [\text{xor}(p, s) \mid R]$;
 - $\text{magic}([p \mid R], s) \Rightarrow [p \mid \text{magic}(R, s)]$;

Improving Efficiency

- Recall the *isAcyclic* example.
- There there might be occasion to compute the same thing multiple times, for example
 $\text{isLeaf}(\text{Node}, \text{Graph})$
may be called **multiple times** for a given Graph:
 - $\text{hasLeaf}(\text{Graph}) = \text{some}((\text{Node}) \Rightarrow \text{isLeaf}(\text{Node}, \text{Graph}), \text{nodes}(\text{Graph}))$;
- Each time isLeaf is called, $\text{map}(\text{first}, \text{Graph})$ is recomputed
 - $\text{isLeaf}(\text{Node}, \text{Graph}) = \text{member}(\text{Node}, \text{map}(\text{first}, \text{Graph}))$;
- It may be better to compute $\text{map}(\text{first}, \text{Graph})$ "up front" and pass it to isLeaf .

Improving Efficiency

- Computing up front means an extra argument to `isLeaf`, which will may clutter the meaning of a given function:
- Below we “promote” `map(first, Graph)` out of `isLeaf`
 - `hasLeaf(Graph) = some((Node)=>isLeaf(Node, map(first, Graph)), nodes(Graph));`
 - `isLeaf(Node, Firsts) = lmember(Node, Firsts);`
- However, it is still may be called once for each node.
- In order to avoid recomputation, we need to promote it out of the call to *some*.
- This can be done with a **local equation**, or “equational guard”:
 - `hasLeaf(Graph) = Firsts = map(first, Graph), some((Node)=>isLeaf(Node, Firsts), nodes(Graph));`

← equational guard

Improving Efficiency

- If we prefer not to use an equational guard, we can pass `Firsts` as an argument to `hasLeaf`:
- Below we “promote” `map(first, Graph)` out of `isLeaf`
 - `hasLeaf2(Graph, Firsts) = some((Node)=>isLeaf(Node, Firsts), nodes(Graph));`
- This will necessitate introduction of a new definition for the original 1-argument `hasLeaf`:
 - `hasLeaf(Graph) = hasLeaf2(Graph, map(first, Graph));`

Improving Efficiency

- Alas, we overlooked at least one little detail:
- *isLeaf* is used in `removeLeaves` as well as in `hasLeaf`, so we'll similarly have to adjust its use there.
 - `removeLeaves(Graph) = removeLeaves2(Graph, map(first, Graph));`
 - `removeLeaves2(Graph, Firsts) = drop(((Arc)=>isLeaf(second(Arc), Firsts)), Graph);`

Improving Efficiency

- There is still one obvious inefficiency:
 - `map(first, Graph)` is computed in both `hasLeaf` and `removeLeaves`; We'd prefer to compute it only once.
 - The low-level definition (using recursion instead of *iterate*) then might be:
 - `isAcyclic(Graph) = Firsts = map(first, Graph), hasLeaf2(Graph, Firsts) ? isAcyclic(removeLeaves2(Graph, Firsts)) : null(Graph);`
- Alternatively, we could construct a different version of *iterate*, but it would seem to be rather special purpose.

Closing Notes on Efficiency

- In previous slides, we used the property of **referential transparency** of functional languages (that expressions can be substituted for equivalent expressions) to improve efficiency.
- It would not generally be possible to do such substitutions in an imperative language; procedures that have side-effects cannot be substituted so freely.
- Transforming a program in the manner shown may impair its clarity and readability; so it is better to maintain a perhaps less-efficient reference version apart from the “production” version.

Mixed Functional Programming Examples

- Use low-level or high-level, whatever fits best
 - Maybe start with low-level, and the use high-level retrospectively
- Radix conversion
 - Tail recursion
- Tree searching

Convert Number to Binary

- Example:
 - $\text{toBinary}(37) \leftrightarrow [1, 0, 0, 1, 0, 1]$
 $32 + 0*16 + 0*8 + 4 + 0*2 + 1$
- First try: use method discussed in class earlier:
 - divide by 2, record remainder, continue with quotient
 - until 0

Convert Number to Binary

- Rules:
 - $\text{toBinary1}(0) \Rightarrow [];$
 - $\text{toBinary1}(N) \Rightarrow [\underbrace{N\%2}_{\text{remainder}} \mid \underbrace{\text{toBinary1}(N/2)}_{\text{quotient}}];$
- Problems with this definition?

Convert Number to Binary

- Another try:
 - $\text{toBinary}(N) = \text{toBinary2}(N, []);$
 - $\text{toBinary2}(0, \text{Acc}) \Rightarrow \text{Acc};$
 - $\text{toBinary2}(N, \text{Acc}) \Rightarrow$
 $\text{toBinary2}(\underbrace{N/2}_{\text{quotient}}, \underbrace{[N\%2 \mid \text{Acc}]}_{\text{remainder}});$
- Why is this definition better?
- What is still lacking?

Accumulators and Tail Recursion

- From previous slide:
 - $\text{toBinary2}(0, \text{Acc}) \Rightarrow \text{Acc};$
 - $\text{toBinary2}(N, \text{Acc}) \Rightarrow$
 $\text{toBinary2}(N/2, [N\%2 \mid \text{Acc}]);$
- Acc is called an "accumulator" argument:
 - It "accumulates" the result until the basis case is reached, the "unloads" it.
- This type of recursion is called "tail recursion":
 - There is no "cleanup" to be done after the recursive call to toBinary2 , and therefore no need to "stack" calls.
 - We can effectively "turn over control" to the subordinate call, giving a form of **iteration**.

Accumulators and Tail Recursion

- | | |
|---|---|
| ● $\text{toBinary2}(37, []) \rightarrow$ | ● $\text{toBinary1}(37) \rightarrow$ |
| ● $\text{toBinary2}(18, [1]) \rightarrow$ | ● $[1 \mid \text{toBinary1}(18)] \rightarrow$ |
| ● $\text{toBinary2}(9, [0, 1]) \rightarrow$ | ● $[1, 0 \mid \text{toBinary1}(9)] \rightarrow$ |
| ● $\text{toBinary2}(4, [1, 0, 1]) \rightarrow$ | ● $[1, 0, 1 \mid \text{toBinary1}(4)] \rightarrow$ |
| ● $\text{toBinary2}(2, [0, 1, 0, 1]) \rightarrow$ | ● $[1, 0, 1, 0 \mid \text{toBinary1}(2)] \rightarrow$ |
| ● $\text{toBinary2}(1, [0, 0, 1, 0, 1]) \rightarrow$ | ● $[1, 0, 1, 0, 0 \mid \text{toBinary1}(1)] \rightarrow$ |
| ● $\text{toBinary2}(0, [1, 0, 0, 1, 0, 1]) \rightarrow$ | ● $[1, 0, 1, 0, 0, 1 \mid \text{toBinary1}(0)] \rightarrow$ |
| ● $[1, 0, 0, 1, 0, 1]$ | ● $[1, 0, 1, 0, 0, 1] [] \leftrightarrow$ |
| | ● $[1, 0, 1, 0, 0, 1]$ |

Notes:

- Can similarly convert to any given base.
- Can pass the base as an argument.
- Can convert back (from numeral list to number).

Exercise

- Construct fromBinary, e.g.
 - fromBinary([1, 0, 0, 1, 0, 1]) ⇔ 37
- Considerations:
 - Do we need an accumulator?
 - Can it be done with tail-recursion?
 - Try it and see.

An Approach

- Write **iterative** pseudo-code, then construct recursive equivalent.
- L = ... list to be converted ...; Result = 0; while(L != []) { Result = 2*Result + first(L); L = rest(L); } ... answer is in Result ...
- Defining fromBinary3(L, Result):
 - fromBinary3([], Result) => Result;
 - fromBinary3([F | R], Result) => fromBinary3(R, 2*Result+F);
 - fromBinary(L) = fromBinary3(L, 0);
- fromBinary3([1, 0, 0, 1, 0, 1], 0) ↗
- fromBinary3([0, 0, 1, 0, 1], 1) ↗
- fromBinary3([0, 1, 0, 1], 2) ↗
- fromBinary3([1, 0, 1], 9) ↗
- fromBinary3([0, 1], 9) ↗
- fromBinary3([1], 18) ↗
- fromBinary3([], 37) ↗
- 37

Exercise

- What if the list were least-significant bit first?
 - Can you do construct the function?
 - Can you construct a tail-recursive implementation?
- Construct the xor function used in the nim move function.
 - This could entail the essence of toBinary and fromBinary in one definition.

Exercises

- Compare "obvious" and tail-recursive forms of:
 - factorial function ($\text{fac}(n) = 1*2*3*...*n$)
 - length function
 - sum of a list
 - reduce
 - reverse

Essential Non-Tail Recursions

- Some functions don't admit a tail-recursive version (unless *reverse* is used before or after):
 - Examples:
 - map, keep, drop
 - append

append Elimination

- When maximum efficiency is desired, uses of append should be avoided.
- It is often possible to get rid of append by defining versions of functions with an extra accumulator argument.
- Example:

```
nodes(Graph) =
  remove_duplicates(append(map(first, Graph),
                             map(second, Graph)));
```
- Show how to avoid append by generalizing map to take an accumulator.