## CS109A Notes for Lecture 3/11/96

#### Substrings

In ML notation, x is a substring of y if  $y = u^x^v$  for some strings u and v.

• Similar notion for lists, i.e., y = u@x@v.

**Example:** The substrings of aba are  $\epsilon$  (the empty string), a, b, ab, ba, and aba.

- Note that a substring need not be *proper* (i.e., less than the whole string).
- Special case: prefix of y is any substring x that begins at the beginning of y.

**Example:** Prefixes of aba are  $\epsilon$ , a, ab, and aba.

• Special case: suffix of y is a substring that ends at the end of y.

**Example:** Suffixes of aba are  $\epsilon$ , a, ba, and aba.

#### Subsequences

A subsequence of a string y is what we can obtain by striking out 0 or more of the positions of y.

**Example:** Subsequences of aba are  $\epsilon$ , a, b, ab, ba, aa, aba.

- A common subsequence of x and y is a string that is a subsequence of both.
- A longest common subsequence (LCS) of x and y is a common subsequence of x and y that is as long as any common subsequence of these strings.

# Why LCS's?

- Secret of the UNIX diff command (find the differences between two files).
  - diff finds a LCS of the two files and assumes the changes are "everything else."
- Generalizations important in matching of DNA sequences.

## An Exponential LCS Algorithm

The following assumes two lists (not strings) and computes their LCS:

```
fun lcs(_,nil) = nil
lcs(nil,_) = nil
lcs(x::xs, y::ys) =
if x=y then x::lcs(xs,ys)
else let
   val l1 = lcs(xs, y::ys);
  val l2 = lcs(x::xs, ys);
in
  if length(l1) > length(l2)
    then l1
  else l2
end;
```

- Problem: If size n = sum of the lengths of the lists, then there are two recursive calls to **lcs** on arguments of one smaller size.
  - Leads to recurrence relation T(n) = O(n) + 2T(n-1), with solution  $O(2^n)$ .

# **Dynamic Programming Solution**

Recursions like this waste time because they wind up solving the same problem repeatedly.

**Example:** If x = [1, 2, 3, 4] and y = [a, b, c, d], we call **1cs** twice on ([2, 3, 4], [b, c, d]), four times on ([3, 4], [c, d]), and so on.

• Dynamic programming solutions tabulate the answers to subproblems, so they are available for use many times.

**Example:** The most common example is computing  $\binom{n}{m}$  by the recursion  $\binom{n}{m} = \binom{n-1}{m-1} + \binom{n-1}{m}$  vs. computing it by Pascal's triangle (see p. 172, FCS).

- For LCS, build an array L such that L[i][j] is the length of the LCS for the first i positions of x and the first j positions of y.
  - Given this array, filled in, one can easily recover an LCS see p. 324 ff, FCS.

• Fill in order of i + j.

**Basis:** i + j = 0. Surely L[0][0] = 0.

#### Induction:

- If either i or j is 0, then L[i][j] = 0.
- If neither is 0, consider  $a_i$  and  $b_j$ , the *i*th and *j*th elements of strings x and y, respectively.
  - $\Box$  If  $a_i = b_j$ , L[i][j] = 1 + L[i-1][j-1].
  - $\begin{tabular}{ll} $\square$ & Otherwise, $L[i][j]$ is the larger of $L[i][j-1]$ and $L[i-1][j]$. \\ \end{tabular}$
- Either way, the *L* entries needed have already been computed.

## Running Time of LCS

If  $n = \text{sum of lengths of strings, time is } O(n^2)$ .

• Fill  $(n+1)^2$  entries, each in O(1) time.