

## Chapter 3. Dynamic Programming. (Part 1)

Example 1. Mātrāvṛtta : the study of poetic meter  
(prosody 音律).

- light <sup>syllable</sup> ~~beats~~ lasts 1 beat
- heavy syllable last 2 beats.

4-beat meters: — — , — •• , •— , •• — , ••••

↑                  ↑  
long              short

Observation: number of meter of  $n$  beats  
is the sum of  $\sim n-1$  and

$$M(n) = M(n-1) + M(n-2),$$

with base case  $M(0) = 1$ ,  $M(1) = 1$ .

↳ Shows that  $\Theta(2^n)$ .

Memoization: Remember everything (if undef, fill in).

Dynamic programming, filling tables deliberately.  
 ↗ planning or schedules

Example 2. Interpunctio Verborum Redux.

Given a string  $A[1..n]$  and a subroutine ISWORD that determines whether a given string is a word.

Ask whether  $A$  can be partitioned into a seq of words.

▷ Define a function, `Splittable(i)` returns true

$\Leftrightarrow$  the suffix  $A[i..n]$  can be partitioned into seq of words.

→ Need: Splittable (1).



$$\text{Splittable}(i) = \begin{cases} \text{TRUE} & \text{if } i > n \\ \bigvee_{j=i}^n (\text{ISWORD}(i, j) \wedge \text{Splittable}(j+1)) & \text{o.w.} \end{cases}$$

Directly impl will cause  $O(2^n)$  in the worst case.

▷ Memorize function Splittable into array

Splittable[1..n+1].

▷ Each subprob Splittable(i) depends only on res of subprobs Splittable(j) ( $j > i$ ).

▷ fills the array in decr indx order.

```

FAST SPLITTABLE(A[1..n]):
    SplitTable[n+1] ← True
    for i ← n downto 1:
        SplitTable[i] ← FALSE
        for j ← i to n:
            if ISWORD(i, j) and SplitTable[j+1]:
                SplitTable[i] ← True.
    return SplitTable[1].
    
```

1. The pattern : Smart Recursion.

▷ Recursion without repetition

Dynamic Programming is not filling in tabs.  
It's about Smart Recursion!



## ▷ Processes

### I. Formulate the problem recursively.

repr your answer by smaller subprobs.

- Specification — what's the problem going to solve
- Solution — clear recursive formula or algo for the whole prob in terms of exactly the same prob.

### II. Build sols to your recur. from bottom up.

- Identify subprobs
- Choose a memoization data structure
- Identify dependencies
- Find a good eval order Be careful!
- Analyze space & Running Time

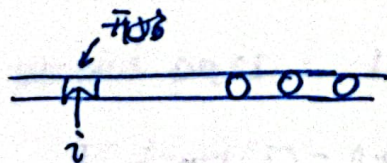
□

### Example 3. Longest Increasing Subseq.

- The recur. form.

$\text{LISbigger}(i, j) := \text{length of LIS of } A[j \dots n]$   
every elem is larger than  $A[i]$ .

$$\text{LISbigger}(i, j) = \begin{cases} 0 & j > n \\ \text{LISbigger}(i, j+1) & A[i] > A[j] \\ \max \left\{ \begin{array}{l} \text{LISbigger}(i, j+1) \\ \text{LISbigger}(j, j+1) + 1 \end{array} \right\} & \text{o.w.} \end{cases}$$



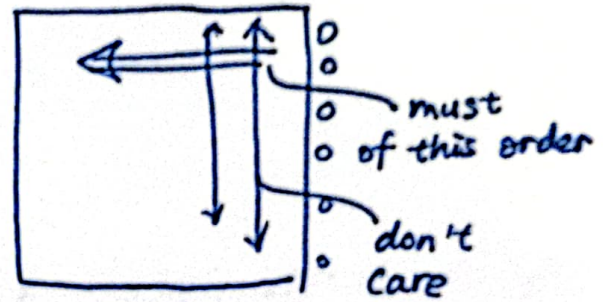
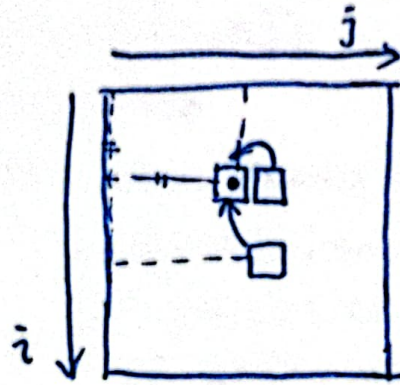
▷ Only  $O(n^2)$  distinct subproblems to consider.

▷ Store it in 2D array  $\text{LISbigger}[0..n, 1..n]$ .



- Evaluation order

▷ Each entry  $LISbigger[i, j]$  is filled after  $\sim [i, j+1]$   
 $\sim [j, j+1]$



FAST LIS( $A[1..n]$ )

$A[0] \leftarrow -\infty$

for  $i \leftarrow 0$  to  $n$

$LISbigger[i, n+1] \leftarrow 0$  } base case.

for  $j \leftarrow n$  downto 1

for  $i \leftarrow 0$  to  $j-1$

keep  $\leftarrow 1 + LISBIGGER[j, j+1]$

skip  $\leftarrow LISBIGGER[i, j+1]$

if  $A[i] \geq A[j]$

$LISBIGGER[i, j] \leftarrow skip$

else

$LISBIGGER[i, j] \leftarrow \max\{keep, skip\}$

return  $LISbigger[0, 1]$

- The second pass :  $LISFirst(i) := LIS$  begin with  $A[i]$

i.e.  $LISfirst(i) = 1 + \max\{LISFirst(j) : (j > i) \wedge (A[j] > A[i])\}$

as  $\max \emptyset = 0$ .

and  $A[0] \leftarrow -\infty$ .

· dependency:  $LISFirst[i]$  depends only on  $LISFirst[j]$   
as  $j > i$ .

FAST LIS<sub>2</sub>(A[i..n]):

$A[0] = -\infty$

for  $i \leftarrow n$  downto 0

$LISFirst[i] \leftarrow 1$

for  $j \leftarrow i+1$  to  $n$

if  $A[j] > A[i]$  and  $1 + LISfirst[j] > LISFirst[i]$

$LISFirst[i] \leftarrow 1 + LISfirst[j]$

return  $LISfirst[0] - 1$ .

~~Example 4. Edit distance.~~