

# 课程尚未开始 请大家耐心等待

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# Dynamic Programming

九章算法IT求职面试培训课程 第5章

[www.ninechapter.com](http://www.ninechapter.com)

# Number Triangle

<http://www.lintcode.com/zh-cn/problem/number-triangle/>

<http://www.ninechapter.com/solutions/triangle/>

# Triangle

// dfs(x,y) 从x,y走到最下面一层的最短距离

// answer: dfs(0,0)

```
int dfs(int x, int y) {  
    if (x == n) {  
        return 0;  
    }  
    if (hash[x][y] != -1) {  
        return hash[x][y];  
    }  
    hash[x][y] = Min(dfs(x + 1, y), dfs(x + 1, y + 1)) + a[x][y];  
    return hash[x][y];  
}
```

# 动态规划的4点要素

1. **状态 State** (灵感, 创造力, 存储小规模问题的结果)
2. **方程 Function** (状态之间的联系, 怎么通过小的状态, 来算大的状态)
3. **初始化 Intialization** (最极限的小状态是什么, 起点)
4. **答案 Answer** (最大的那个状态是什么, 终点)

# 如何想到使用DP

1. One of the following three :

- a) Maximum/Minimum
- b) Yes/No
- c) Count all possible solutions

2. Can not sort / swap

<https://oj.leetcode.com/problems/longest-consecutive-sequence/>

# 面试最常见的四种类型

1. Matrix DP (10%)
2. Sequence (40%)
3. Two Sequences DP (40%)
4. Backpack (10%)

# 1. Matrix DP

state:  $f[x][y]$  表示我从起点走到坐标 $x,y$ .....

function: 研究最后一步怎么走

intialize: 起点

answer: 终点



# Unique Paths

<http://www.lintcode.com/zh-cn/problem/unique-paths/>

<http://www.ninechapter.com/solutions/unique-paths/>

# Unique Paths

state:  $f[x][y]$  从起点到  $x, y$  的路径数

function: (研究倒数第一步)

$$f[x][y] = f[x - 1][y] + f[x][y - 1]$$

intialize:  $f[0][0] = 1$

$$// f[0][i] = 1, f[i][0] = 1$$

answer:  $f[n-1][m-1]$

# Unique Paths II

<http://www.lintcode.com/zh-cn/problem/unique-paths-ii/>

<http://www.ninechapter.com/solutions/unique-paths-ii/>

# Minimum Path Sum

<http://www.lintcode.com/zh-cn/problem/minimum-path-sum/>

<http://www.ninechapter.com/solutions/minimum-path-sum/>

# Minimum Path Sum

state:  $f[x][y]$  从起点走到  $x, y$  的最短路径

function:  $f[x][y] = \min(f[x-1][y], f[x][y-1]) + \text{cost}[x][y]$

intialize:  $f[0][0] = \text{cost}[0][0]$

//  $f[i][0] = \text{sum}(0, 0 \rightarrow i, 0)$

//  $f[0][i] = \text{sum}(0, 0 \rightarrow 0, i)$

answer:  $f[n-1][m-1]$

**5 minutes break**

## 2. Sequence Dp

state:  $f[i]$ 表示“前 $i$ ”个位置/数字/字母,(以第 $i$ 个为)...

function:  $f[i] = f[j] \dots j$  是 $i$ 之前的一个位置

intialize:  $f[0]..$

answer:  $f[n-1]..$

# Climbing Stairs

<http://www.lintcode.com/zh-cn/problem/climbing-stairs/>

<http://www.ninechapter.com/solutions/climbing-stairs/>



# Climbing Stairs

**state:**  $f[i]$ 表示前 $i$ 个位置, 跳到第 $i$ 个位置的方案总数

**function:**  $f[i] = f[i-1] + f[i-2]$

**intialize:**  $f[0] = 1$

**answer:**  $f[n]$

# Jump Game

<http://www.lintcode.com/zh-cn/problem/jump-game/>

<http://www.ninechapter.com/solutions/jump-game/>

# Jump game

state:  $f[i]$  代表我能否跳到第  $i$  个位置

function:  $f[i] = \text{OR}(f[j], j < i \ \&\& \ j \text{ 能够跳到 } i)$

initialize:  $f[0] = \text{true};$

answer:  $f[n-1]$

# Jump Game II

<http://www.lintcode.com/zh-cn/problem/jump-game-ii/>

<http://www.ninechapter.com/solutions/jump-game-ii/>

## Jump game II

state:  $f[i]$  代表我跳到这个位置最少需要几步

function:  $f[i] = \text{MIN}(f[j]+1, j < i \ \&\& \text{j能够跳到i})$

initialize:  $f[0] = 0;$

answer:  $f[n-1]$

# Palindrome Partitioning II

<http://www.lintcode.com/zh-cn/problem/palindrome-partitioning-ii/>  
<http://www.ninechapter.com/solutions/palindrome-partitioning-ii/>

# Palindrome Partitioning ii

state:  $f[i]$  "前 $i$ "个字符组成的字符串需要最少几次cut

function:  $f[i] = \text{MIN}(f[j]+1, j < i \ \&\& \ j+1 \sim i \text{这一段是一个回文串})$

intialize:  $f[i] = i - 1$  ( $f[0] = -1$ )

answer:  $f[s.length()]$

# Word Segmentation

<http://www.lintcode.com/zh-cn/problem/word-segmentation/>

<http://www.ninechapter.com/solutions/word-break/>



# Word Segmentation

state:  $f[i]$ 表示前 $i$ 个字符能否被完美切分

function:  $f[i] = \text{OR}(f[j], j < i, j+1 \sim i \text{是一个词典中的单词})$

intialize:  $f[0] = \text{true}$

answer:  $f[s.length()]$

注意:切分位置的枚举->单词长度枚举

$O(NL)$ ,  $N$ : 字符串长度,  $L$ : 最长的单词的长度

# Longest Increasing Subsequence

<http://www.lintcode.com/zh-cn/problem/longest-increasing-subsequence/>

<http://www.ninechapter.com/solutions/longest-increasing-subsequence/>

# Longest Increasing Subsequence

state:

错误的方法:  $f[i]$  表示前  $i$  个数字中最长的 LIS 的长度

正确的方法:  $f[i]$  表示前  $i$  个数字中以第  $i$  个结尾的 LIS 的长度

function:  $f[i] = \text{MAX}(f[j] + 1, j < i \ \&\& \ a[j] \leq a[i])$

intialize:  $f[0..n-1] = 1$

answer:  $\text{max}(f[0..n-1])$

# LIS 贪心反例

1 1000 2 3 4

10 11 12 1 2 3 4 13

### 3. Two Sequences Dp

state:  $f[i][j]$  代表了第一个sequence的前*i*个数字 / 字符 配上第二个sequence的前*j*个...

function:  $f[i][j]$  = 研究第*i*个和第*j*个的匹配关系

intialize:  $f[i][0]$  和  $f[0][i]$

answer:  $f[s1.length()][s2.length()]$

# Longest Common Subsequence

<http://www.lintcode.com/en/problem/longest-common-subsequence/>

<http://www.ninechapter.com/solutions/longest-common-subsequence/>

# Longest Common Subsequence

state:  $f[i][j]$  表示前  $i$  个字符配上前  $j$  个字符的 LCS 的长度

function:  $f[i][j] = f[i-1][j-1] + 1$  //  $a[i] == b[j]$   
 $= \text{MAX}(f[i-1][j], f[i][j-1])$  //  $a[i] != b[j]$

intialize:  $f[i][0] = 0$

$f[0][j] = 0$

answer:  $f[a.length()][b.length()]$

# Longest Common Substring

<http://www.lintcode.com/en/problem/longest-common-substring/>

<http://www.ninechapter.com/solutions/longest-common-substring/>



# Longest Common Substring

state:  $f[i][j]$  表示前  $i$  个字符配上前  $j$  个字符的 LCS 的长度  
(一定以第  $i$  个和第  $j$  个结尾的 LCS)

function:  $f[i][j] = f[i-1][j-1] + 1$  //  $a[i] == b[j]$   
 $= 0$  //  $a[i] != b[j]$

intialize:  $f[i][0] = 0$   
 $f[0][j] = 0$

answer:  $\text{MAX}(f[0..a.length()][0..b.length()])$

# Edit Distance

<http://www.lintcode.com/en/problem/edit-distance/>  
<http://www.ninechapter.com/solutions/edit-distance/>

# Edit Distance

**state:**  $f[i][j]$  a的前i个字符配上b的前j个字符最少要用几次编辑使得他们相等

**function:**

$f[i][j] = \text{MIN}(f[i-1][j-1], f[i-1][j]+1, f[i][j-1]+1) \quad // \quad a[i] == b[j]$

$= \text{MIN}(f[i-1][j], f[i][j-1], f[i-1][j-1]) + 1 \quad // \quad a[i] != b[j]$

**intialize:**  $f[i][0] = i, f[0][j] = j$

**answer:**  $f[a.length()][b.length()]$

# 其他题目

Distinct Subsequence  
Interleaving String

## 4. Backpack

题目: 给 $n$ 个正整数, 一个数 $target$ , 问能否从 $n$ 个数中取出**若干**个数, 他们的和为 $target$ 。

state:  $f[i][S]$  “前 $i$ ”个数字, 取出一些能否组成和为 $S$

function:  $f[i][S] = f[i-1][S - a[i]]$  or  $f[i-1][S]$

intialize:  $f[0][0] = \text{true}$ ;  $f[0][1..SUM] = \text{false}$

answer:  $f[n][target]$

# k Sum

n个数, 取k个数, 组成和为target

state:  $f[i][j][t]$  前个数取j个数出来能否和为t

function:  $f[i][j][t] = f[i - 1][j - 1][t - a[i]]$  or  $f[i - 1][j][t]$

1. 问是否可行 (DP)
2. 问方案总数 (DP)
3. 问所有方案 (递归/搜索)

# 最小调整代价

n个数, 可以对每个数字进行调整, 使得相邻的两个数的差都 $\leq \text{target}$ , 调整的费用为

$$\text{Sigma}(|A[i] - B[i]|)$$

A[i]原来的序列 B[i]是调整后的序列

$A[i] < 200$ ,  $\text{target} < 200$

让代价最小

B[woB[]B[]B[B

# 最小调整代价

state:  $f[i][v]$  前 $i$ 个数, 第 $i$ 个数调整为 $v$ , 满足相邻两数 $\leq \text{target}$ , 所需要的最小代价

function:  $f[i][v] = \min(f[i-1][v'] + |A[i]-v|, |v-v'| \leq \text{target})$

answer:  $f[n][...]$

$O(n * A * T)$



# Conclusion

4 key points of DP:

1. State
2. Function
3. Initialize
4. Answer

# Recursive VS DP

递归是一种程序的实现方式:函数的自我调用

```
Function(x) {  
    ...  
    Funciton(x-1);  
    ...  
}
```

动态规划是一种解决问题的思想:大规模问题的结果,是由小规模问题的结果运算得来的。

动态规划可以用递归来实现(Memorization Search)