

AVL Tree:

每个操作 $O(\log n)$

Definition

An empty binary tree is height balanced. (定义深度为-1)

If T is a nonempty binary tree with T_L and T_R as its left and right subtrees,

T is balanced iff:

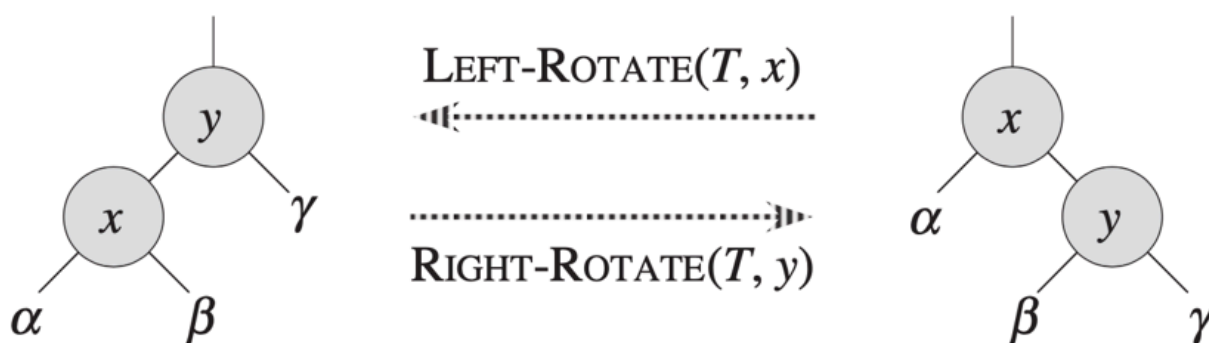
(1) T_L and T_R are height balanced;

(2) $|h_L - h_R| \leq 1$

The balance factor **BF(node)** = $h_L - h_R$. In an AVL tree, $\text{BF}(\text{node}) \in -1, 0, 1$

Rotation 旋转

- Time Complexity $O(1)$
- 从叶子往上找到第一个bug节点
- 左高右旋右高左旋
- LL, RR, LR, RL
- Left Rotate 左旋
- Right Rotate 右旋



Insertion

Trouble Maker节点在:

左子树的左子树: 右旋 **LL rotation**

右子树的右子树: 左旋 **RR rotation**

左子树的右子树: 从下往上先左旋再右旋 **LR rotation**

右子树的左子树: 从下往上先右旋再左旋 **RL rotation**

深度为 h 的树最少结点数 $n_h = n_{h-1} + n_{h-2} + 1 = F(h + 3) - 1$ for $h \geq -1$, F 为斐波那契数。

$$F_i \approx \frac{1}{\sqrt{5}} \left(\frac{1+\sqrt{5}}{2} \right)^i$$

$$n_h = O(\ln n)$$

Splay Tree

Definition

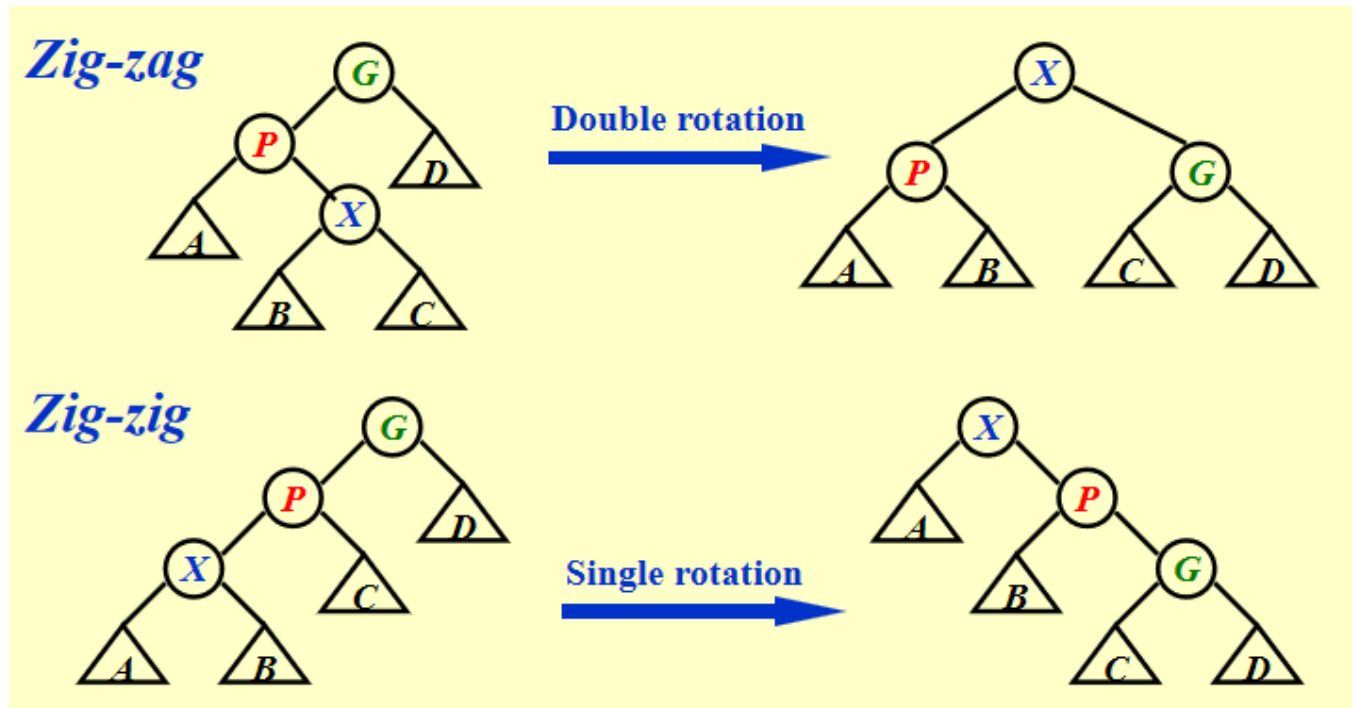
连续M次操作总共不超过 $O(M \log n)$

摊还成本 Amortized cost $O(\log N)$!!!

IDEA: After a node is accessed, it is pushed to the ROOT by a series of AVL tree rotations.

总是把最坏操作拎到根节点

- zig-zag: 拎当前节点*2
- zig-zig: 先拎父节点再转这个节点



Splaying not only moves the accessed node to the root, but also roughly halves the depth of most nodes on the path.

Deletion

Step 1: Find X (and then X becomes the root)

Step 2: Remove X

Step 3: FindMax(T_L) (and the largest element becomes the root of T_L)

Step 4: Make T_R the right child of the root of T_L

Time Analysis

- worst-case bound
- amortized bound
- average-case bound

$worst - casebound \geq amortizedbound \geq average - casebound$

方法:

- Aggregate analysis
- Accounting method
- Potential method

Amortized Analysis

Target: 连续M次操作作为 $O(M \log N)$

Aggregate analysis

Idea : Show that for all n , a sequence of n operations takes worst-case time $T(n)$ in total. In the worst case, the average cost, or amortized cost, per operation is therefore $T(n)/n$.

Accounting method

amortized cost \hat{c}_i

actual cost c_i

$$\hat{c}_i - c_i = \text{credit} (>= 0)$$

We MUST have:

$$T_{\text{amortized}} = \frac{\sum_{i=1}^n \hat{c}_i}{n} \geq \frac{\sum_{i=1}^n c_i}{n}$$

- average case bound

Potential method

(for amortized analysis)

$$\hat{c}_i - c_i = \text{Credit} = \Phi(D_i) - \Phi(D_{i-1})$$

$$\sum_{i=1}^n \hat{c}_i = \sum_{i=1}^n (c_i + \Phi(D_i) - \Phi(D_{i-1}))$$

$$= \left(\sum_{i=1}^n c_i \right) + \Phi(D_n) - \Phi(D_0)$$

势能函数初始 **全局最小**, $\Phi(D_n) - \Phi(D_0) \geq 0$.

Splay Tree

$$\Phi(T) = \sum \text{Rank}(i)$$

$$\text{Rank}(i) = \log S(i)$$

$S(i)$ is the number of descendants of i including itself

- **Zig**

$$\begin{aligned} \hat{c}_i &= 1 + R2(x) - R1(x) + R2(P) - R1(P) \\ &\leq 1 + R2(x) - R1(x) \end{aligned}$$

- **Zig-zag**

$$\begin{aligned}
& \hat{c}_i \\
&= 2 + R2(x) - R1(X) + R2(P) - R1(P) + R2(G) - R1(G) \\
&= 2 - R1(X) + R2(P) - R1(P) + R2(G) \\
&= (2 + R2(P) + R2(G)) - R1(X) - R1(P) \\
&\leq 2(R2(x) - R1(x))
\end{aligned}$$

- theory: If $a + b \leq c$, then $\log(a) + \log(b) \leq 2\log(c) - 2$.
- Zig-zig**

$$\begin{aligned}
& \hat{c}_i \\
&= 2 + R2(x) - R1(x) + R2(P) - R1(P) + R2(G) - R1(G) \\
&\leq 3(R2(x) - R1(x)) \\
&\quad \mathbf{S1(x) + S2(G) = S2(x)} \\
&\Rightarrow \hat{c}_i = 2 - R1(x) + R2(P) - R1(P) + R2(G) \\
&\leq 2 - R1(x) + R2(P) - R1(P) + 2 * R2(x) - 2 - R1(x) \\
&= 2(R2(x) - R1(x)) + R2(P) - R1(P) \\
&\leq 3(R2(X) - R1(X))
\end{aligned}$$

Therorem

The amortized time to splay a tree with root T at node X is at most $3(R(T) - R(x)) + 1 = O(\log N)$

Red-Black Tree

Definition

1. 非红即黑
2. 根黑
3. 叶子节点（外部）（哨兵节点）NIL为黑（所有“叶子”的子节点都是NIL）
4. 红节点的儿子是黑色，黑节点的儿子可以是黑色
5. 对每一个节点，到所有后代的路径中包含相同数量的黑色节点

black-height (bh)

从x到叶子节点的黑节点个数（不含x）， $bh(Tree) = bh(root)$

有N个内部节点的树最高 $2\ln(N+1)$

- 1. $sizeof(x) \geq 2^{bh(x)} - 1$ (prove by induction)
- 2. $bh(Tree) \geq h(Tree)/2$

Insertion

插入并染红 -> 破坏2, 4

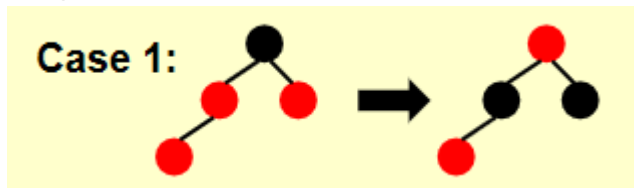
case1:

将父节点染黑 -> 父节点的兄弟染黑 -> 将爷爷染红 锅甩给爷爷（只改色不旋转）

一路甩到根 -> 根染黑

甩到根的儿子 -> 那没事了

$O(\log N)$

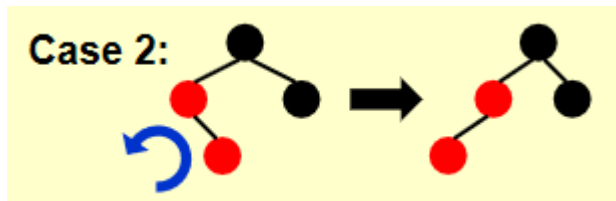


“叔叔你怎么已经黑了？”

case2:

我在右边 -> 绕父节点左旋变成case3 （加上case3一共旋转2次）

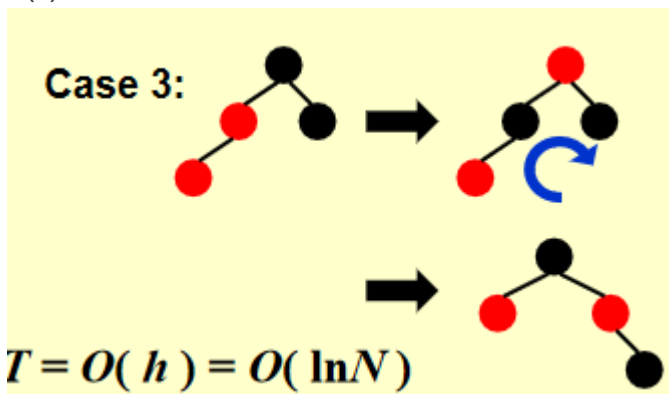
$O(1)$



case3:

我在左边 -> 染完了，不平衡了，向右转 （转1次）

$O(1)$



最多旋转2次!

Deletion

- 总之是删了个叶子
(直接删目标叶子or用后代叶子的值替代目标节点然后删叶子)

1. 红叶子，无事发生

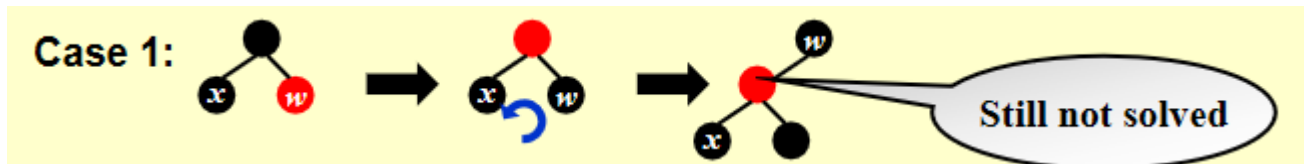
2. 黑叶子 -> 身上叠两层黑（很黑） -> 破坏1

(1) 父节点红，兄弟黑

-> 父亲变黑兄弟变红 -> ok了，把叶子删掉

(2) **case1:** 兄弟红（父亲一定黑）

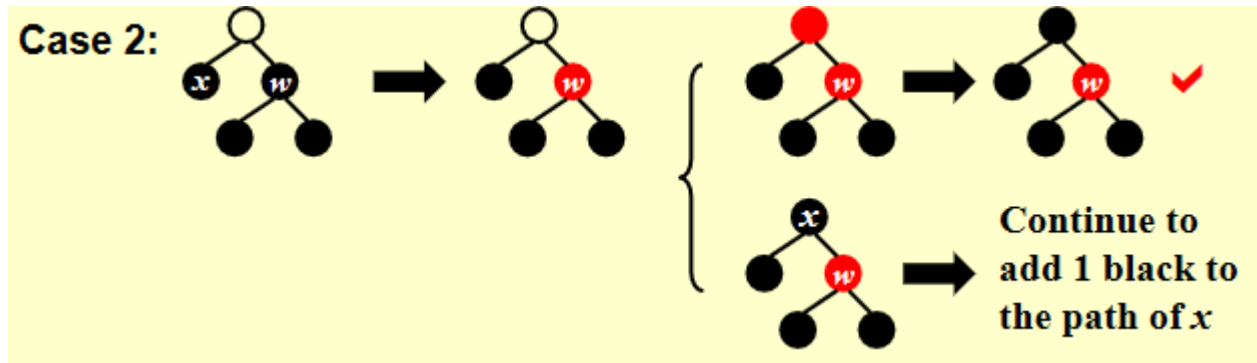
-> 父亲变红，兄弟变黑，兄弟转上去，黑侄子变兄弟 -> 同一种情况



(3) 兄弟为黑:

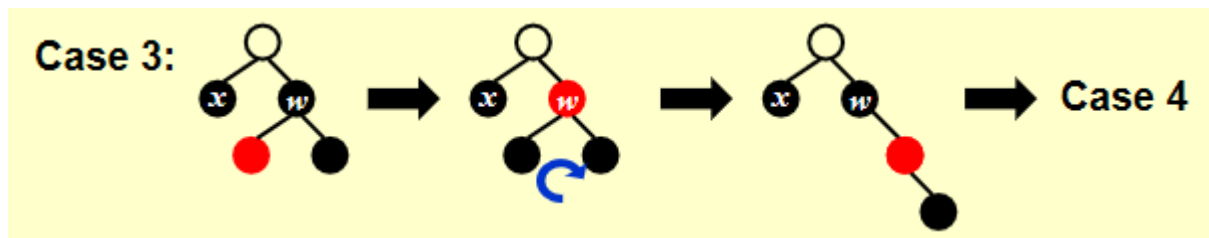
- case2: 侄子均黑

-> 兄弟变红，黑色传给父亲 -> 父亲红变黑 or 父亲已经是黑色，向上甩锅



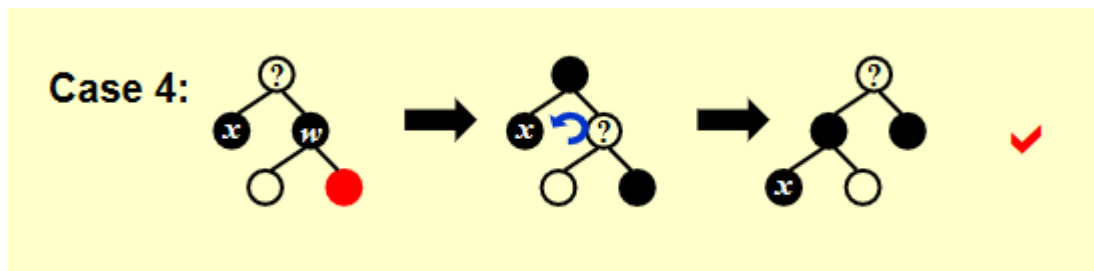
- case3: 近侄子红，远侄子黑

-> 近侄子染黑，转成兄弟 -> 变成case4



- case4: 近侄子随便，远侄子红

-> 父节点与兄弟节点交换颜色，远侄子染黑 -> 兄弟节点转上去 -> 删除



B+ Tree

Definition

A B+ Tree of order M:

- root is either a leaf or has 2~M children
- all nonleaf nodes have between $\lceil \frac{M}{2} \rceil$ and M children
- all leaves are at the same depth

B+ Tree of order 4: "2-3-4 tree"

真实数据在叶子里，父节点保存从第二个子树开始每个子树的最小元素

M通常为3~4

Find

和BST差不多

Insertion

找位置 $O(\log N)$; 插入节点内 $O(M)$; 总共 $O(\log N)$

- 节点内满了 -> 向上递归分裂

Deletion

- 能删就直接删
- 节点键不够 -> 与兄弟合并
- 合并后向上递归

Inverted File Index 倒排表

Term-Document Incidence Matrix

稀疏矩阵表示文档及其包含的词

-> 词典terms + 出现次数times + 出现文档documents

查找时按照出现次数从小到大取交集

- 词干处理 Word Stemming (时态不管)
- 停用词 Stop Words (a an the等高频词)
- 定义偏序关系 (如词典序), 用树处理

Distribute indexing

- Solution 1: Term-partitioned index
- Solution 2: Document-partitioned index
 - 第一种方案效率高, 因为可以同时查询多个词
 - 第二种方案鲁棒性高, 因为不容易完全崩掉啥也查不到 (最多查不全)

Dynamic indexing

维护两套索引| main index 和 auxiliary index

向 auxiliary index 添加新内容, 定期合并到 main index

删除时打上“删除了!”的标签

两套 index 都要查找

Posting list

记录单词出现的位置

-> 数字太大

-> 保存相邻两个位置的差值

Thresholding

重要性排序

Leftist Heaps 左偏树/左偏堆

Definition

$Npl(NULL) = -1$

$Npl(X) = \min\{Npl(X) + 1 \text{ for } C \text{ in children of } X\}$

$npl(\text{null path length})$ 左 \geq 右 for all nodes

左偏性 (leftist heap property) : For every node X in the heap, the npl of the left child is at least as large as that of the right child.

Theorem

A leftist tree with r nodes on the right path must have at least $2^r - 1$ nodes.

Merge

merge H1 & H2:

H1 == NULL -> H2;

H2 == NULL -> H1;

取根节点键较小的作为H1,

H1为单个节点 -> H1->left = H2

else

- H1->right = Merge(H1->right, H2)
- swap H1->left H1->right if necessary
- H1->npl = H1->right->npl + 1

$T = (\log N)$

Delete

delete the root

merge subtrees

$T = O(\log N)$

Skew Heaps 斜堆

Target

连续M次操作 $O(M * \log N)$

$T_{amortized} = O(\log N)$

Merge

空 + ? -> ?

非空 + 非空 -> 取较小的根，新根的右儿子与另一树合并

ALWAYS 交换左右儿子

Insertion

新节点与旧树merge

Deletion

删除根节点，左右子树合并

amortized analysis

- heavy: 右子树节点数 > 左子树
- light: 左子树节点数 > 右子树
- D_i = root of the resulting tree
- 势能函数 $\Phi(D_i)$ = num of heavy nodes
- 仅原树右支上的节点状态改变
- l: light; h: heavy
在右支上:
合并前 $\Phi_0 = h_1 + h_2 + h$
合并后 $\Phi_N \leq l_1 + l_2 + h$
- $T_{worst} = l_1 + h_1 + l_2 + h_2$
 $T_{amortized} = T_{worst} + \Phi_N - \Phi_0 \leq 2(l_1 + l_2) = O(\log N)$

Binomial Queues

Structure

- a **collection** of heap-ordered trees, known as a **forest**
- each heap-ordered tree is a binomial tree
- a binomial tree of height 0 is a one-node tree
- a binomial tree B_k of height k is formed by attaching a B_{k-1} to the root of another B_{k-1}
- B_k consists a root with k children $B_1 \dots B_k$, has 2^k nodes, and has C_k^d (or $\binom{k}{d}$) nodes at depth d

Find Min

choose from $\lceil \log N \rceil$ roots, $T_p = O(\log N)$

Merge

树的高度不重复 -> 保留

两森林中有相同高度 (k) 的二项堆 -> 合并为高度k+1的树

类似二进制加法, 第i位代表高度为i的树, $1 + 1 \rightarrow$ 进位

使用左儿子右兄弟存储每棵树。为了方便合并两棵树, 兄弟应当从高到矮

Delete Min

找到最小的根节点

把它删掉, 它的儿子加入队列等待合并

原队列与新队列合并

Time Analysis

Claim: A binomial queue of N elements can be built by N successive insertions in $O(N)$ time

- 势能分析

高开销 -> 降低树的数量; 低开销 -> 树变多

以树的数量作为势能

$C_i ::=$ cost of i th insertion

$\Phi_i ::=$ num of trees after i th insertion

$$C_i + (\Phi_i - \Phi_{i-1}) = 2$$

$$\sum_{i=1}^N (C_i + \Phi_i - \Phi_{i-1}) = 2N$$

$$\sum_{i=1}^N C_i = 2N - \Phi_N \leq 2N = O(N)$$

$$T_{worst} = O(\log N), T_{amortized} = 2$$

Backtracking 回溯算法

Usually using depth first search.

UNDO if fail !!!

Eight queens

Turnpike Reconstruction Problem

Given $N(N-1)/2$ distances, reconstruct a point set of N from the distances.

Stick Problem

Cut a number of small sticks of the same length into sections at random and put back together. Find the minimum possible length of the original sticks.

Suppose i th section is put into the $X[i]$ th stick.

The i th layer in the game tree is the place of the i th section.

Candidates are the divisors of the total length.

剪枝办法:

- 长度比最长木棍还短

三子棋

MiniMax Strategy (probably with alpha-beta pruning that limits the searching to only $O(\sqrt{N})$, N is the size of the full game tree)

Eight digits

A digit board with eight digits and an empty space, aiming to put them into the right order. Find the minimum number of moves.

剪枝办法:

- 忽略空格交换的约束条件，最少情况仍大于已有情况则剪掉

Devide and Conquer 分治

Definition

Recursively:

- Devide the problem into a number of sub-problems
- Conquer the sub-problems by solving them recursively
- Combine the solutions to the sub-problems into the solution for the original problem

Time Analysis

$$T(N) = a * T(N/b) + f(N)$$

- $f(N) = cN : T(N) = O(N \log N)$
- $f(N) = cN^2 : T(N) = O(N^2)$

Wrong guess:

$$T(N) = 2 \lfloor \frac{N}{2} \rfloor + N = O(N)$$

Suppose $T(m) \leq cm$ for all $m \leq N/2$,

then $T(N) \leq cN + N = O(N)$ (**FALSE!**)

Master Method 主方法

$$T(N) = \begin{cases} \Theta(N^{\log_b a}) & f(N) = O(N^{\log_b a - \xi}) \\ \Theta(N^{\log_b a} \log N) & f(N) = \Theta(N^{\log_b a}) \\ \Theta(f(N)) & f(N) = \Omega(N^{\log_b a + \xi}) \end{cases}$$

Another form:

$$T(N) = aT(N/b) + \Theta(N^k \log^p N)$$
$$T(N) = \begin{cases} O(N^{\log_b a}) & a > b^k \\ O(N^k \log^{p+1} N) & a = b^k \\ O(N^k \log^p N) & a < b^k \end{cases}$$

Dynamic Programming 动态规划

状态：唯一表达一个子问题的解；

状态+状态转移方程确定一个算法

要按照规模递减~（比较好写代码）

- 定义状态
- 以第一步或最后一步为例思考如何切割，写出状态转移方程
- 检查最优子结构是否成立（原问题最优解是否建立在子问题最优解之上）

斐波那契数

矩阵乘法排序

$M_{a*b} \cdot M_{b*c}$ 的时间复杂度为 $O(abc)$

对于 $M_{10*20} * M_{20*50} * M_{50*1} * M_{1*100}$ ，不同乘法顺序的时间复杂度不同

计算 $M_1 * M_2 * M_3 * \dots * M_n$ ：

- 暴力枚举的方案数 b_n ：
对最外面两个括号 $(M_1 * \dots * M_k) * (M_{k+1} * \dots * M_n)$ ，两侧括号位置已定，枚举中间") ("的位置。
然后分成两个子问题 $M_1 * \dots * M_k$ 和 $M_{k+1} * \dots * M_n$

$$b_n = \sum_{i=1}^{n-1} b_i b_{n-i} = O\left(\frac{4^n}{n\sqrt{n}}\right)$$

- 动态规划：
 $F[N] = \sum F[i] * F[N-i]$ （不能唯一确定）
=> 用 $F[N][i]$ 表示从开始长度为N的序列的最小代价（唯一确定）
考虑 $(M_1 M_2)(M_3 M_4)$ ：总代价为 $F[2][1] + F[2][3] + R_1 * C_2 * C_4$
则

$$F[N][i] = \min_{1 \leq k < N} \{F[k][i] + F[N-k][i+k] + R_i * C_{i+k-1} * C_{i+N-1}\}$$

Optional Binary Search Tree

Given N words $w_1 < w_2 < \dots < w_N$, and the probability of searching for each w_i is p_i . Arrange these words in a BST that minimize the expected total access time.

$F[N][i]$ 表示规模为N，从 w_i 开始的子问题

$$F[N][i] = \min_{0 \leq k \leq N} \left\{ \sum_{j=i}^{i+N-1} p_j + F[k][i] + F[N-k-1][i+k+1] \right\}$$

All-Pairs Shortest Path

Product Assembly

$F[N][i]$ 表示装前N个零部件后在第i条生产线 ($i \in \{0, 1\}$)

$$F[N][i] = \min\{F[N-1][0] + t_{0 \rightarrow i}, F[N-1][1] + t_{1 \rightarrow i}\}$$