绪论

复杂度分析:级数

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谁校对时间,谁就会突然老去。

# 算法分析

- ❖两个主要任务 = 正确性(不变性 x 单调性) + 复杂度
- ❖ 为确定后者,真地需要将算法描述为RAM的基本指令,再统计累计的执行次数?不必!
- ❖ C++等高级语言的基本指令,均等效于常数条RAM的基本指令;在渐进意义下,二者大体相当
  - 分支转向:goto //算法的灵魂;出于结构化考虑,被隐藏了
  - 迭代循环: for()、while()、... //本质上就是 "if + goto"
  - 调用 + 递归(自我调用) //本质上也是goto
- **❖** 复杂度分析的主要方法
  - 迭代:级数求和
  - 递归:递归跟踪 + 递推方程
  - 猜测 + 验证

### 级数

**令**算术级数:与末项平方同阶
  $T(n) = 1 + 2 + ... + n = \binom{n+1}{2} = \frac{n(n+1)}{2} = \frac{n(n+1)}{2} = \mathcal{O}(n^2)$ 

 \* 幂方级数:比幂次高出一阶
  $\sum_{k=0}^{n} k^d \approx \int_0^n x^d dx = \left. \frac{x^{d+1}}{d+1} \right|_0^n = \frac{n^{d+1}}{d+1} = \mathcal{O}(n^{d+1})$ 

$$T_2(n) = \sum_{k=1}^{n} k^2 = 1^2 + 2^2 + 3^2 + \dots + n^2 = n(n+1)(2n+1)/6 = \mathcal{O}(n^3)$$

$$T_3(n) = \sum_{k=1}^n k^3 = 1^3 + 2^3 + 3^3 + \dots + n^3 = n^2(n+1)^2/4 = \mathcal{O}(n^4)$$

$$T_4(n) = \sum_{k=1}^{n} k^4 = 1^4 + 2^4 + 3^4 + \dots + n^4 = n(n+1)(2n+1)(3n^2 + 3n - 1)/30 = \mathcal{O}(n^5)$$

#### ❖ 几何级数:与末项同阶

$$T_a(n) = \sum_{k=0}^n a^k = a^0 + a^1 + a^2 + a^3 + \dots + a^n = \frac{a^{n+1} - 1}{a - 1} = \mathcal{O}(a^n), \quad 1 < a$$

$$T_2(n) = \sum_{k=0}^{n} 2^k = 1 + 2 + 4 + 8 + \dots + 2^n = 2^{n+1} - 1 = \mathcal{O}(2^{n+1}) = \mathcal{O}(2^n)$$

### 收敛级数

$$\sum_{k=2}^{n} \frac{1}{(k-1) \cdot k} = \frac{1}{1 \cdot 2} + \frac{1}{2 \cdot 3} + \frac{1}{3 \cdot 4} + \dots + \frac{1}{(n-1) \cdot n} = 1 - \frac{1}{n} = \mathcal{O}(1)$$

$$\sum_{k=1}^{n} \frac{1}{k^2} = 1 + \frac{1}{2^2} + \frac{1}{3^2} + \dots + \frac{1}{n^2} < 1 + \frac{1}{2^2} + \frac{1}{3^2} + \dots = \frac{\pi^2}{6} = \mathcal{O}(1)$$

$$\sum_{k \text{ is a new fact nower}} \frac{1}{k-1} = \frac{1}{3} + \frac{1}{7} + \frac{1}{8} + \frac{1}{15} + \frac{1}{24} + \frac{1}{26} + \frac{1}{31} + \frac{1}{35} + \dots = 1 = \mathcal{O}(1)$$

- **◇几何分布:**  $(1-\lambda)\cdot[1+2\lambda+3\lambda^2+4\lambda^3+...] = 1/(1-\lambda) = \mathcal{O}(1), \quad 0<\lambda<1$
- ❖ 有必要讨论这类级数吗?

难道,基本操作次数、存储单元数可能是分数?

是的,某种意义上!

# 不收敛,但有限

**᠅调和级数:**  $h(n) = \sum_{k=1}^{n} \frac{1}{k} = 1 + \frac{1}{2} + \frac{1}{3} + \frac{1}{4} + \dots + \frac{1}{n} = \ln n + \gamma + \mathcal{O}(\frac{1}{2n}) = \Theta(\log n)$ 

\* 対数级数: $\sum_{k=1}^{n} \ln k = \ln \prod_{k=1}^{n} k = \ln n! \approx (n+0.5) \cdot \ln n - n = \Theta(n \cdot \log n)$ 

 \* 対数 + 线性 + 指数:
  $\sum_{k=1}^{n} k \cdot \log k \approx \int_{1}^{n} x \ln x dx = \frac{x^{2} \cdot (2 \cdot \ln x - 1)}{4} \Big|_{1}^{n} = \mathcal{O}(n^{2} \log n)$ 

$$\sum_{k=1}^{n} k \cdot 2^{k} = \sum_{k=1}^{n} k \cdot 2^{k+1} - \sum_{k=1}^{n} k \cdot 2^{k} = \sum_{k=1}^{n+1} (k-1) \cdot 2^{k} - \sum_{k=1}^{n} k \cdot 2^{k}$$

$$= n \cdot 2^{n+1} - \sum_{k=1}^{n} 2^{k} = n \cdot 2^{n+1} - (2^{n+1} - 2) = (n-1) \cdot 2^{n+1} + 2 = \mathcal{O}(n \cdot 2^{n})$$

❖如有兴趣,不妨读读: Concrete Mathematics

//ex-2.35, Goldbach Theorem