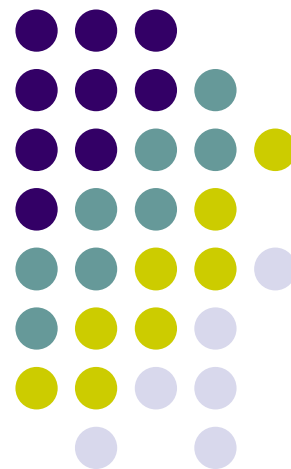


# 递归数列及函数 “增长”

离散数学教学组





# 回顾

- 鸽笼原理
  - 基本的原理
  - 一般的鸽笼原理
  - 运用的例子
- 排列与组合
  - 基本的排列组合
  - 组合与二项式系数
  - 有重复的排列组合

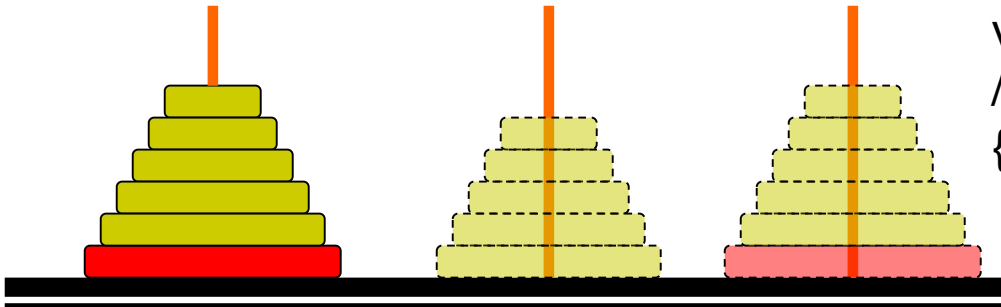
# 提要

- 递归数列
- 函数“增长”



# 递归思维：例 1

- 汉诺塔问题: How many moves are need to move all the disks to the third peg by moving only one at a time and never placing a disk on top of a smaller one.



$$T(1) = 1$$

$$T(n) = 2T(n-1) + 1$$

```
void hanoi(int n,char one, two, three)
// 将n个盘从one座借助two座,移到three座
{
    void move(char x,char y);
    if(n==1) then move(one,three);
    else {
        hanoi(n-1,one,three,two);
        move(one,three);
        hanoi(n-1,two,one,three);
    }
}
```

# 汉诺塔问题的解

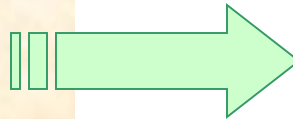
$$T(n) = 2T(n-1) + 1$$

$$2T(n-1) = 4T(n-2) + 2$$

$$4T(n-2) = 8T(n-3) + 4$$

.....

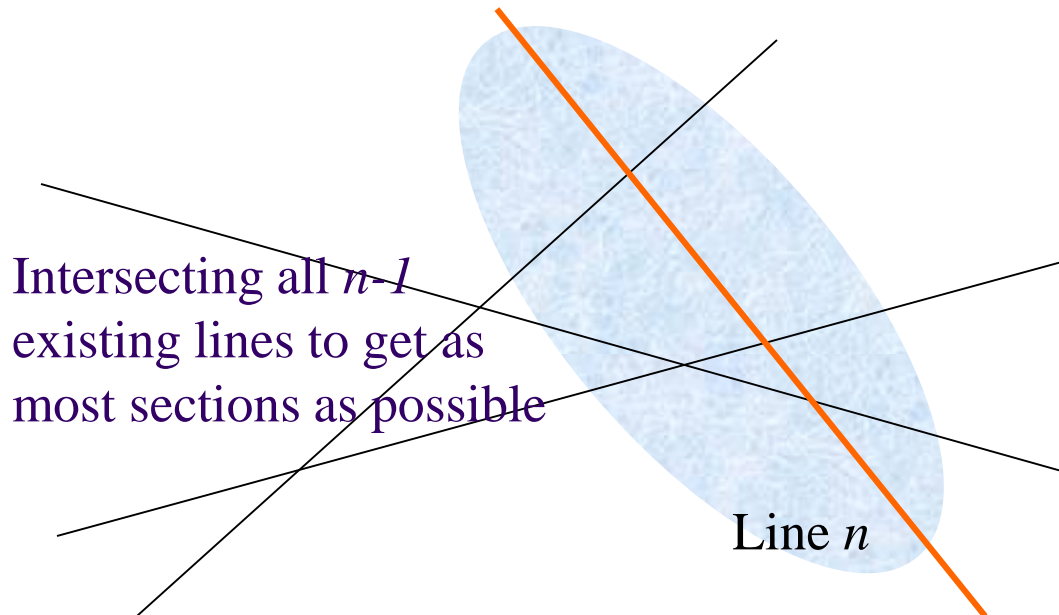
$$2^{n-2}T(2) = 2^{n-1}T(1) + 2^{n-2}$$



$$***T(n) = 2^n - 1***$$

# 递归思维：例 2

- Cutting the plane
  - How many sections can be generated **at most** by  $n$  straight lines with infinite length?



$$L(0) = 1$$

$$L(n) = L(n-1) + n$$

# Solution of Cutting the Plane

$$\begin{aligned}L(n) &= L(n-1) + n \\&= L(n-2) + (n-1) + n \\&= L(n-3) + (n-2) + (n-1) + n \\&= \dots\dots \\&= L(0) + 1 + 2 + \dots\dots + (n-2) + (n-1) + n\end{aligned}$$

A large blue arrow with a 3D effect points from the ellipsis in the previous equation block to the final formula.
$$L(n) = n(n+1)/2 + 1$$

# 递归思维：例 3

## Josephus Problem

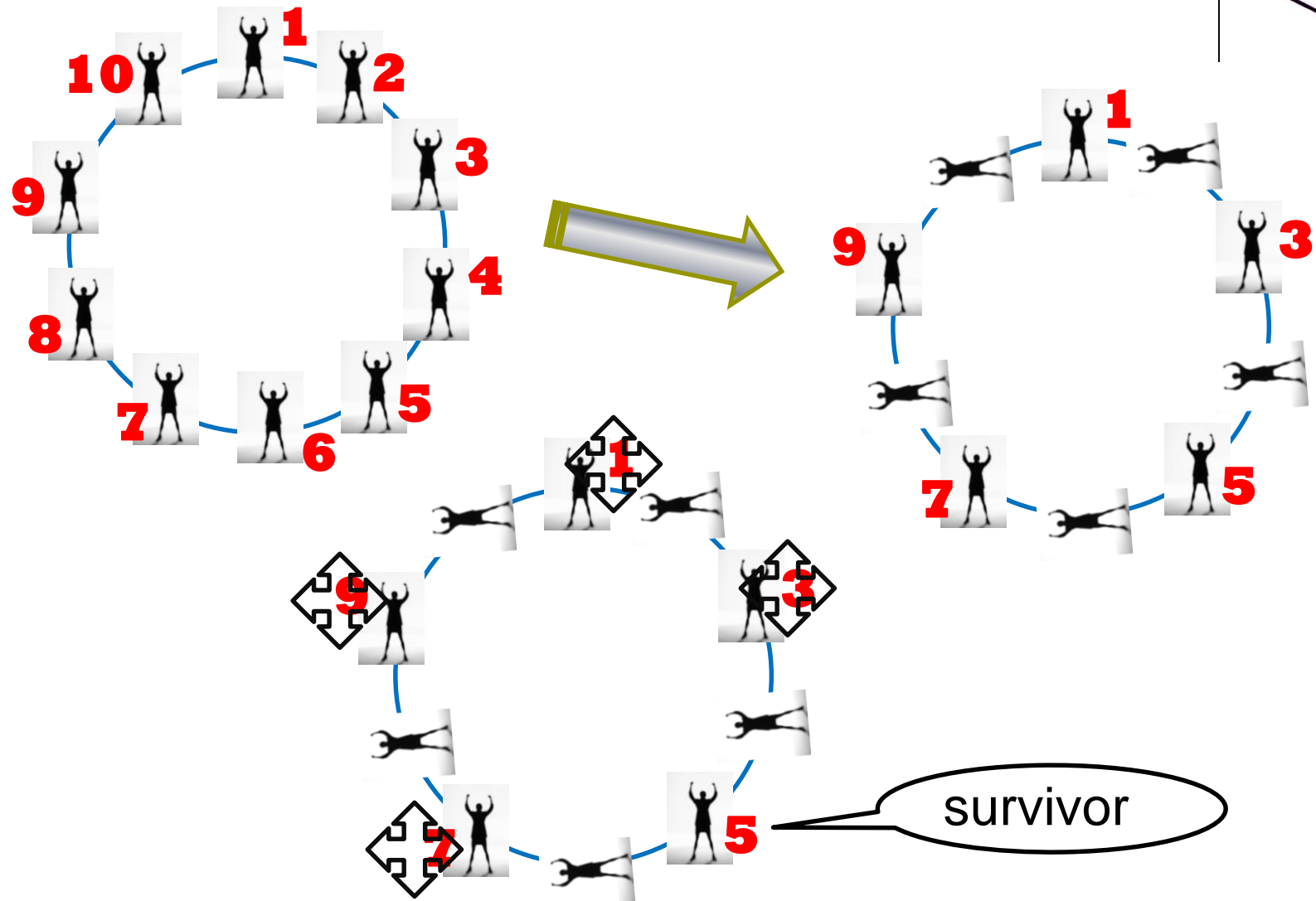


- Live or die, it's a problem!
- Legend has it that Josephus wouldn't have lived to become famous without his mathematical talents. During the Jewish Roman war, he was among a band of 41 Jewish rebels trapped in a cave by the Romans. Preferring suicide to capture, the rebels decided to form a circle and, proceeding around it, to kill every third remaining person until no one was left. But Josephus, along with an unindicted co-conspirator, wanted none of this suicide nonsense; so he quickly calculated where he and his friend should stand in the vicious circle.

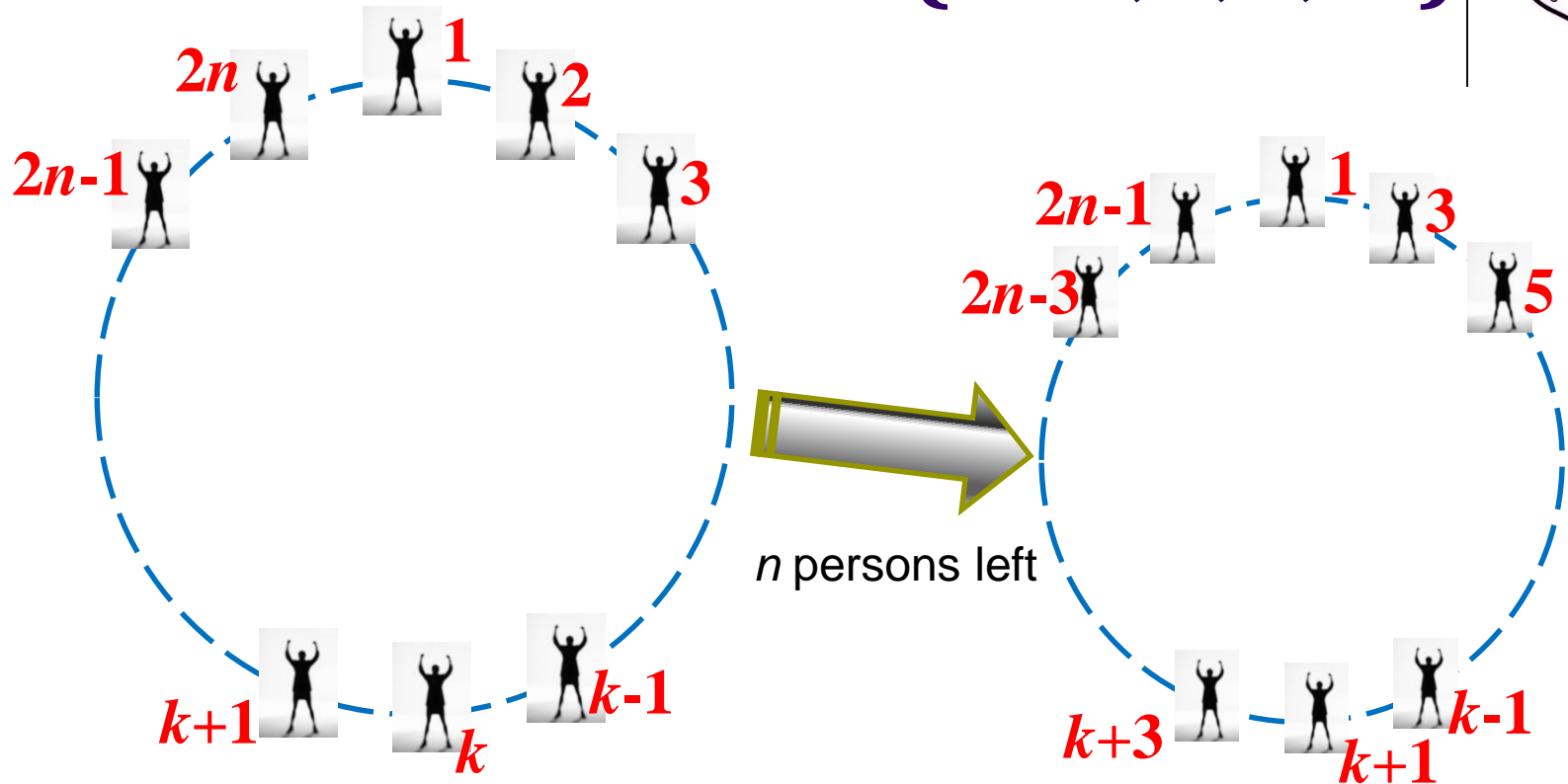
We use a simpler version:  
“every second...”



# Make a Try: for $n=10$



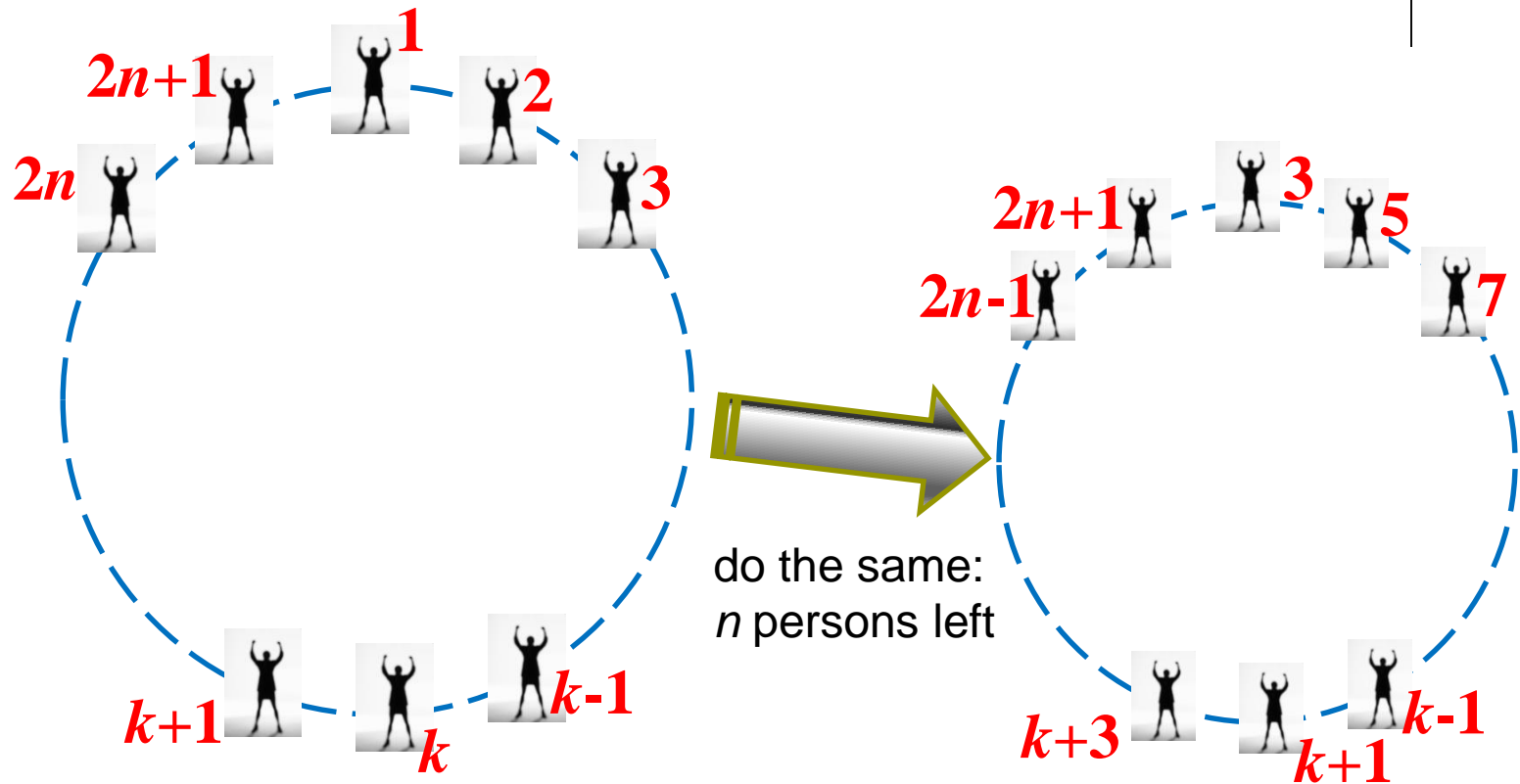
# For $2n$ Persons ( $n=1,2,3,\dots$ )



The solution is: newnumber ( $J(n)$ )

And the newnumber( $k$ ) is  $2k-1$

# And What about $2n+1$ Persons ( $n=1,2,3,\dots$ )



The solution is: newnumber ( $J(n)$ )

And for the time, the newnumber( $k$ ) is  $2k+1$

# Solution in Recursive Equations



$$J(1) = 1;$$

$$J(2n) = 2J(n) - 1, \quad \text{for } n \geq 1;$$

$$J(2n+1) = 2J(n) + 1, \quad \text{for } n \geq 1.$$



# Explicit Solution for small $n$ 's

$n$	1	2 3	4 5 6 7	8 9 10 11 12 13 14 15	16
$J(n)$	1	1 3	1 3 5 7	1 3 5 7 9 11 13 15	1

Look carefully ...  
and, find the pattern...  
and, prove it!



# Eureka!

If we write  $n$  in the form  $n = 2^m + l$ ,  
(where  $2^m$  is the largest power of 2 not exceeding  
 $n$  and where  $l$  is what's left),  
the solution to our recurrence seems to be:

$$J(2^m + l) = 2l + 1, \quad \text{for } m \geq 0 \text{ and } 0 \leq l < 2^m.$$

As an example:  $J(100) = J(64+36) = 36*2+1 = 73$

# Binary Representation

- Suppose  $n$ 's binary expansion is :

$$n = (b_m b_{m-1} \dots b_1 b_0)_2$$

- then:

$$n = (1 b_{m-1} b_{m-2} \dots b_1 b_0)_2 ,$$

$$l = (0 b_{m-1} b_{m-2} \dots b_1 b_0)_2 ,$$









































$$2l = (b_{m-1} b_{m-2} \dots b_1 b_0 0)_2 ,$$

$$2l + 1 = (b_{m-1} b_{m-2} \dots b_1 b_0 1)_2 ,$$

$$J(n) = (b_{m-1} b_{m-2} \dots b_1 b_0 b_m)_2$$



# 递归（递推）

Reproducing pairs (at least two months old)	Young pairs (less than two months old)	Month	Reproducing pairs	Young pairs	Total pairs
	 	1	0	1	1
	 	2	0	1	1
 	 	3	1	1	2
 	   	4	1	2	3
   	     	5	2	3	5
     	         	6	3	5	8

Rabbits and the Fibonacci Numbers



# 递归（递推）数列

- 例子:
  - 4, 7, 10, 13, 16, .....
  - 1, 1, 2, 3, 5, 8, 13, 21, 34, ..... (a)
  - 0, 1, 2, 2, 6, 5, 12, 10, 20, 17, 30, 26, .....
- Recurrence relation: the recursive formula, e.g.:
  - for (a)
    - $f_n = f_{n-1} + f_{n-2} \quad (n > 2), \quad f_1 = f_2 = 1$
    - $f_1 = f_2 = 1$ : initial condition

# 寻找递推公式

- Let  $A=\{0,1\}$ .  $C_n$ : the number of strings of length  $n$  in  $A^*$  that do not contain adjacent 0's
  - $C_1=?$ ;  $C_2=?$ ;
  - $C_3=?$
  - $C_n=?$
- $C_n = C_{n-1} + C_{n-2}$

# 寻找显式公式

- 如何为递归序列给出“显式”的公式
  - 即找到一个以自然数为定义域的函数
- Backtracking
  - E.g. 1:
    - $a_n = a_{n-1} + 3, a_1 = 2$   $\Rightarrow$  recurrence relation
    - $a_n = 2 + 3(n-1)$   $\Rightarrow$  explicit formula
  - E.g. 2
    - $b_n = 2b_{n-1} + 1, b_1 = 7$
    - $b_n = 2^{n+2} - 1$

# Linear Homogeneous Relation

$$a_n = r_1 a_{n-1} + r_2 a_{n-2} + \cdots + r_m a_{n-k}$$

is called linear homogeneous relation of degree  $k$ .

$$c_n = (-2)c_{n-1}$$

$$f_n = f_{n-1} + f_{n-2}$$

**Yes**

$$a_n = a_{n-1} + 3$$

$$g_n = g_{n-1}^2 + g_{n-2}$$

**No**

# 特征方程

- For a linear homogeneous recurrence relation of degree  $k$

$$a_n = r_1 a_{n-1} + r_2 a_{n-2} + \cdots + r_m a_{n-k}$$

the polynomial of degree  $k$

$$x^k = r_1 x^{k-1} + r_2 x^{k-2} + \cdots + r_m$$

is called its **characteristic equation**.

- The characteristic equation of linear homogeneous recurrence relation of degree 2 is:

$$x^2 - r_1 x - r_2 = 0$$



# Solution of Recurrence Relation

- If the characteristic equation  $x^2 - r_1x - r_2 = 0$  of the recurrence relation  $a_n = r_1a_{n-1} + r_2a_{n-2}$  has two distinct roots  $s_1$  and  $s_2$ , then

$$a_n = us_1^n + vs_2^n$$

where  $u$  and  $v$  depend on the initial conditions, is the explicit formula for the sequence.



# Proof of the Solution

Remember the equation :  $x^2 - r_1x - r_2 = 0$

We need prove that :  $us_1^n + vs_2^n = r_1a_{n-1} + r_2a_{n-2}$

$$\begin{aligned}us_1^n + vs_2^n &= us_1^{n-2}s_1^2 + vs_2^{n-2}s_2^2 \\&= us_1^{n-2}(r_1s_1 + r_2) + vs_2^{n-2}(r_1s_2 + r_2) \\&= r_1us_1^{n-1} + r_2us_1^{n-2} + r_1vs_2^{n-1} + r_2vs_2^{n-2} \\&= r_1(us_1^{n-1} + vs_2^{n-1}) + r_2(us_1^{n-2} + vs_2^{n-2}) \\&= r_1a_{n-1} + r_2a_{n-2}\end{aligned}$$

# Solution of Recurrence Relation

- If the equation has a single root  $s$ , then,

$$a_n = us^n + vns^n$$



# Solution of Recurrence Relation

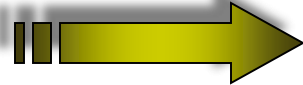
- $c_n = 3c_{n-1} - 2c_{n-2}, c_1 = 5, c_2 = 3$ 
  - Characteristic equation:
    - $X^2 = 3x - 2$ ;
  - Get the root: 1, 2
  - $C_n = u \cdot 1^n + v \cdot 2^n$
  - We have equations:
    - $C_1 = u + 2v = 5$
    - $C_2 = u + 4v = 3$
  - So:  $u = 7, v = -1$
  - So:  $C_n = 7 - 2^n$

# Fibonacci Sequence

$$f_1=1$$

$$f_2=1$$

$$f_n = f_{n-1} + f_{n-2}$$



1, 1, 2, 3, 5, 8, 13, 21, 34, .....

Explicit formula for Fibonacci Sequence

The characteristic equation is  $x^2 - x - 1 = 0$ , which has roots:

$$s_1 = \frac{1 + \sqrt{5}}{2} \quad \text{and} \quad s_2 = \frac{1 - \sqrt{5}}{2}$$

Note: (by initial conditions)  $f_1 = us_1 + vs_2 = 1$  and  $f_2 = us_1^2 + vs_2^2 = 1$

which results:

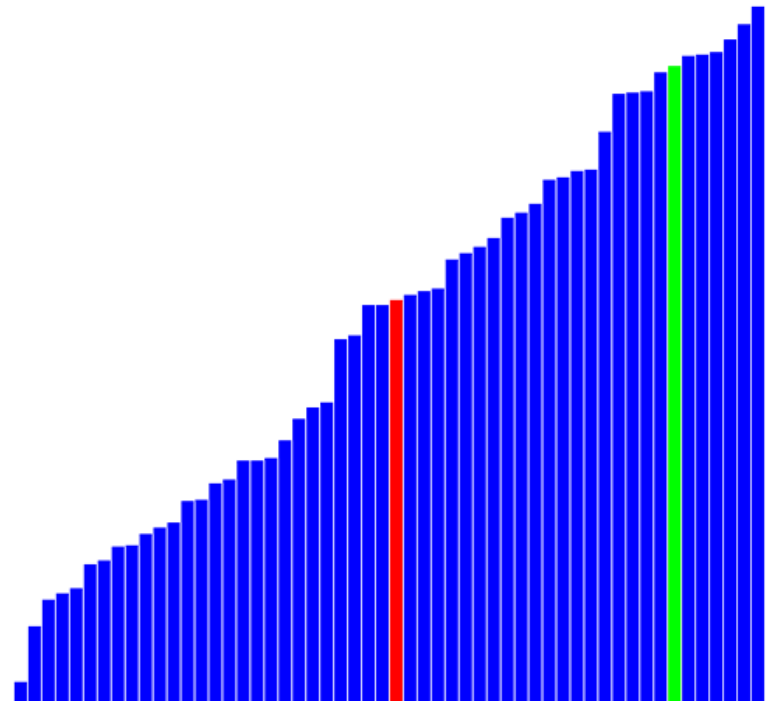
$$f_n = \frac{1}{\sqrt{5}} \left( \frac{1 + \sqrt{5}}{2} \right)^n - \frac{1}{\sqrt{5}} \left( \frac{1 - \sqrt{5}}{2} \right)^n$$

# 算法的执行步骤数

- 算法的正确性 VS 算法的效率
- 如何去评判一个算法的效率？
  - 时间开销: steps
  - 空间开销: memory
- 算法的执行步骤计数是主要手段
  - 算法的执行步骤数不是简单的算法语句条数！

# 从一个已排序的列表中查找

- 线性查找 Linear (sequential) search
- 折半查找 Binary search





# 插入排序法

6   5   3   1   8   7   2   4

遍历所有元素：

构造已排序的子序列；

将待排序元素插入子序列中的合适位置；

# 插入法伪代码

INSERTION-SORT( $A$ )

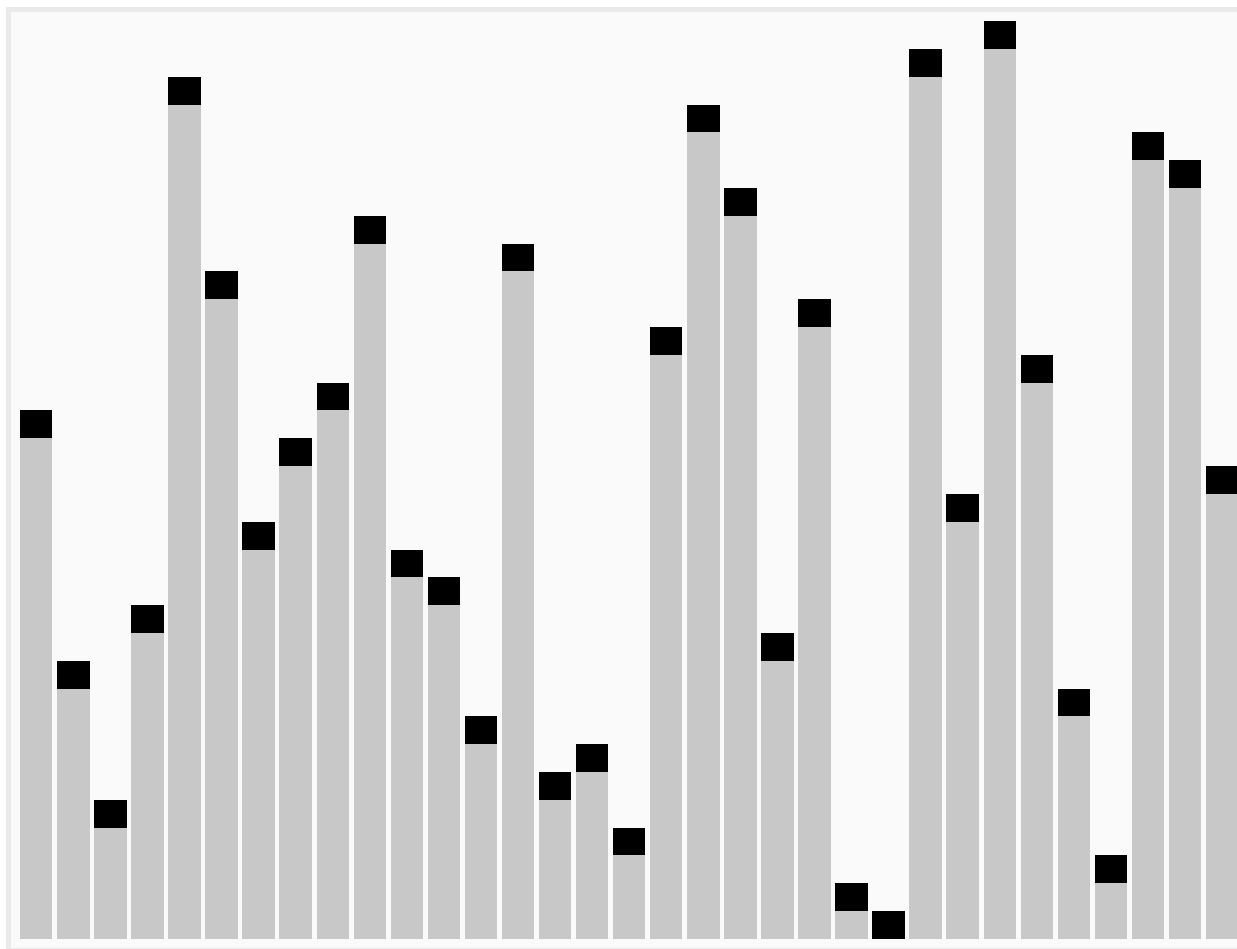
```
1  for  $j = 2$  to  $A.length$ 
2       $key = A[j]$ 
3      // Insert  $A[j]$  into the sorted sequence  $A[1..j-1]$ .
4       $i = j - 1$ 
5      while  $i > 0$  and  $A[i] > key$ 
6           $A[i + 1] = A[i]$ 
7           $i = i - 1$ 
8       $A[i + 1] = key$ 
```

# 冒泡排序



6 5 3 1 8 7 2 4

# 快速排序





# 算法的执行步骤数

N (数据集规模)	$T(n)$ (算法执行步数)
10	550
50	63750
100	505000

算法执行步数随着数据规模的变化而变化  
不同的算法，变化的“剧烈程度”不同

引入一个数学工具  
来刻画这种变化并  
尝试判断其规律



# 算法执行步骤函数

- 针对每个算法，可以定义该算法的执行步骤函数  $T:N \rightarrow N$ ：
  - 数据规模  $\rightarrow$  算法执行步骤数
- 该函数：
  - 每个算法均有最佳情况、最差情况和平均情况下的函数
  - 基本代表一个算法的执行效率
  - 随着数据规模变化，可以考察该函数的“增长”速度



# 算法的效率分析-时间开销

INSERTION-SORT( <i>A</i> )	<i>cost</i>	<i>times</i>
1 <b>for</b> <i>j</i> = 2 <b>to</b> <i>A.length</i>	$c_1$	$n$
2 $key = A[j]$	$c_2$	$n - 1$
3       // Insert $A[j]$ into the sorted sequence $A[1..j - 1]$ .	0	$n - 1$
4 $i = j - 1$	$c_4$	$n - 1$
5 <b>while</b> $i > 0$ and $A[i] > key$	$c_5$	$\sum_{j=2}^n t_j$
6 $A[i + 1] = A[i]$	$c_6$	$\sum_{j=2}^n (t_j - 1)$
7 $i = i - 1$	$c_7$	$\sum_{j=2}^n (t_j - 1)$
8 $A[i + 1] = key$	$c_8$	$n - 1$

对于每个待插入元素，插入已有序子序列时情况不一：

有不同类型的比较次数、因插入而导致的子序列移动也不一定  
定义 $t_j$ 为第 $j$ 个插入数据所进行的比较次数



# 算法的最差性能：

最差性能：待  
排序元素完全  
逆序！

$$\sum_{j=2}^n j = \frac{n(n+1)}{2} - 1$$

and

$$\sum_{j=2}^n (j-1) = \frac{n(n-1)}{2}$$

$$\begin{aligned} T(n) &= c_1 n + c_2(n-1) + c_4(n-1) + c_5 \left( \frac{n(n+1)}{2} - 1 \right) \\ &\quad + c_6 \left( \frac{n(n-1)}{2} \right) + c_7 \left( \frac{n(n-1)}{2} \right) + c_8(n-1) \\ &= \left( \frac{c_5}{2} + \frac{c_6}{2} + \frac{c_7}{2} \right) n^2 + \left( c_1 + c_2 + c_4 + \frac{c_5}{2} - \frac{c_6}{2} - \frac{c_7}{2} + c_8 \right) n \\ &\quad - (c_2 + c_4 + c_5 + c_8). \end{aligned}$$



# 函数的增长-算法分析初步

- 集合A上的关系R, 令  $|A| = n$  ,  $|R| = n^2/2$
- 求该关系的传递闭包算法有: S1算法,S2算法
- 如何去判断哪个算法更好一些?
  - 时间开销: steps
    - $T_{S1}$ 函数;  $T_{S2}$ 函数
  - 如何比较时间开销?
    - 看谁“长得快”!



# 函数增长

N (数据集规模)	S1 (算法执行步数)	S2 (算法执行步数)
10	550	1250
50	63750	781250
100	505000	12500000

两个算法执行步数随着数据规模的变化而变化  
不同的算法，变化的“剧烈程度”不同

需要一种数学工具通过执行步骤函数的处理来反映  
上述“剧烈程度”

# 函数的增长

- 定义函数  $T: N \rightarrow N$ :
  - 数据规模  $\rightarrow$  算法执行步骤数
- 针对上述两个算法:
  - $T_{S1}(n) = n^3/2 + n^2/2$  for algorithm S1
  - $T_{S2}(n) = n^4/8$  for algorithm S2

哪个好一些？

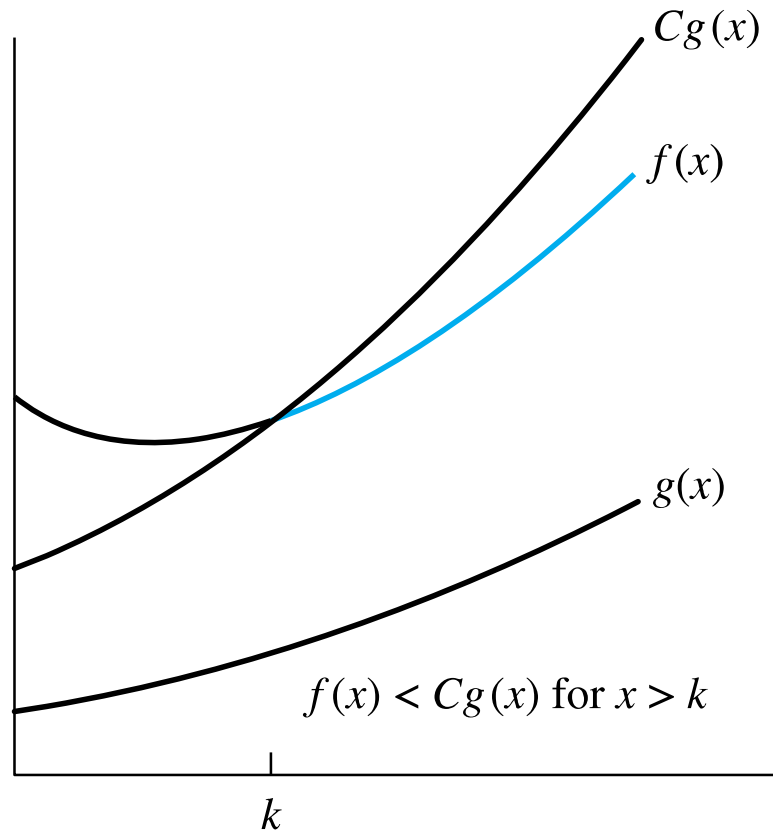


# 函数的增长速度

- 给定  $f:N \rightarrow N$ ,  $g:N \rightarrow N$ , (注: 通常  $N \rightarrow R$ )
  - 如果存在常数  $C \in N$  和  $k \in N$  使得对于所有大于等于  $k$  的  $n$ , 都有  $f(n) \leq C \times g(n)$
  - 我们称:
    - $f$  is  $O(g)$                        $f \in O(g)$
    - $f$  增长速度不高于  $g$



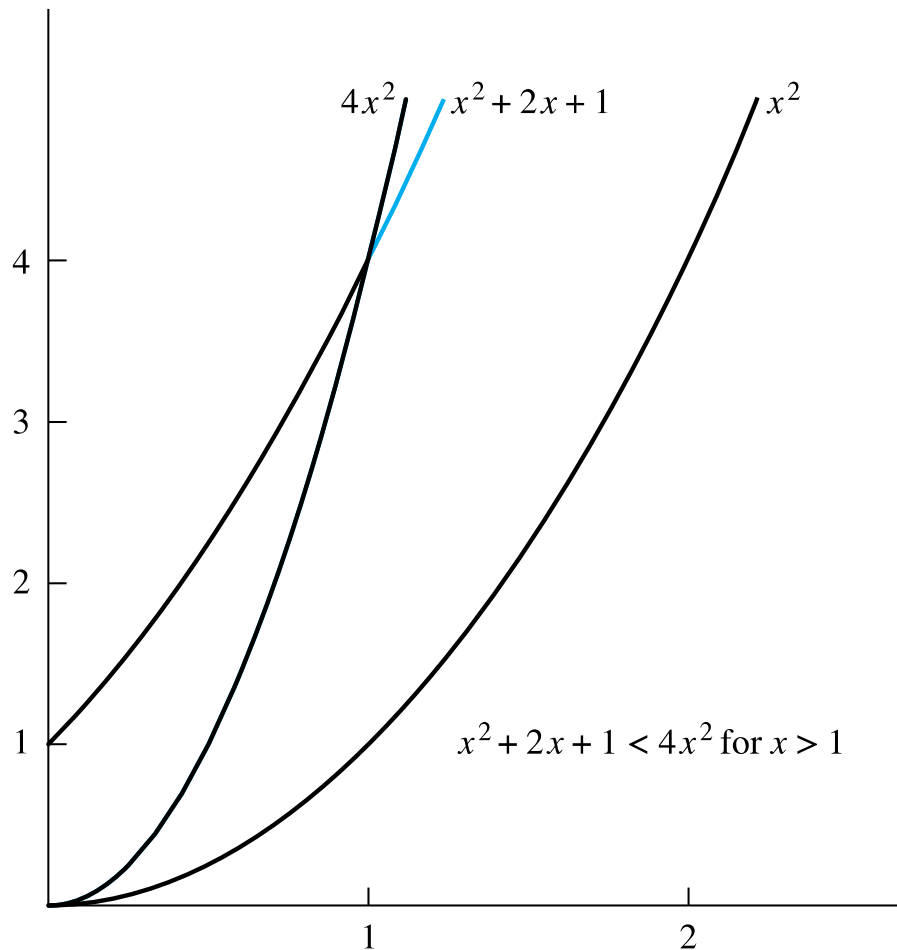
# Big-0 notation的含义



The part of the graph of  $f(x)$  that satisfies  $f(x) < Cg(x)$  is shown in color.

**FIGURE 2** The Function  $f(x)$  is  $O(g(x))$ .

例子:  $x^2 + 2x + 1$  is  $O(x^2)$



The part of the graph of  $f(x) = x^2 + 2x + 1$  that satisfies  $f(x) < 4x^2$  is shown in blue.

# 实际上：

- 可以做如下判断：
  - 函数  $f$  是  $O(g)$  if  $\lim_{n \rightarrow \infty} [f(n)/g(n)] = C < \infty$
  - if there exists constants  $C \in \mathbb{N}$  and  $k \in \mathbb{N}$  such that for all  $n \geq k$ ,  $f(n) \leq Cg(n)$
- 例如: let  $f(n) = n^2$ ,  $g(n) = n \lg n$ , 则:
  - $f$  不是  $O(g)$ , 因为  $\lim_{n \rightarrow \infty} [f(n)/g(n)] = \lim_{n \rightarrow \infty} [n^2 / n \lg n] = \lim_{n \rightarrow \infty} [n / \lg n] = \lim_{n \rightarrow \infty} [1 / (1/n \ln 2)] = \infty$
  - $g$  是  $O(f)$ , 因为  $\lim_{n \rightarrow \infty} [g(n)/f(n)] = 0$

## 再例：

- let  $f(n)=n^2$ ,  $g(n)=7n^2+9n-1$ 
  - $\lim_{n \rightarrow \infty} [f(n)/g(n)] = \lim_{n \rightarrow \infty} [n^2/(7n^2+9n-1)] = 1/7$
  - 所以：  $f$  是  $O(g)$
- $\lim_{n \rightarrow \infty} [g(n)/f(n)] = \lim_{n \rightarrow \infty} [(7n^2+9n-1)/n^2] = 7$
- 所以：  $g$  是  $O(f)$
- 我们称：  $f$  和  $g$  长得一样快(同阶)

# $\Theta$ 关系

- $n^2/100+5n$  是  $O(3n^4-5n^2)$ , 它是  $O(10n^4)$ ?
- $3n^4-5n^2$  和  $10n^4$  长得一样快
- 实际上,  $n^4$  是所有和  $3n^4-5n^2$  同阶的函数中的最简形式
- 定义  $N$  to  $R^+$  函数集合上的关系  $\Theta$ :
  - $f \Theta g$  iff  $f$  和  $g$  同阶
  - $3n^4-5n^2 \Theta 10n^4, (n^4, 3n^4-5n^2) \in \Theta$
- 定理:  $\Theta$  是等价关系



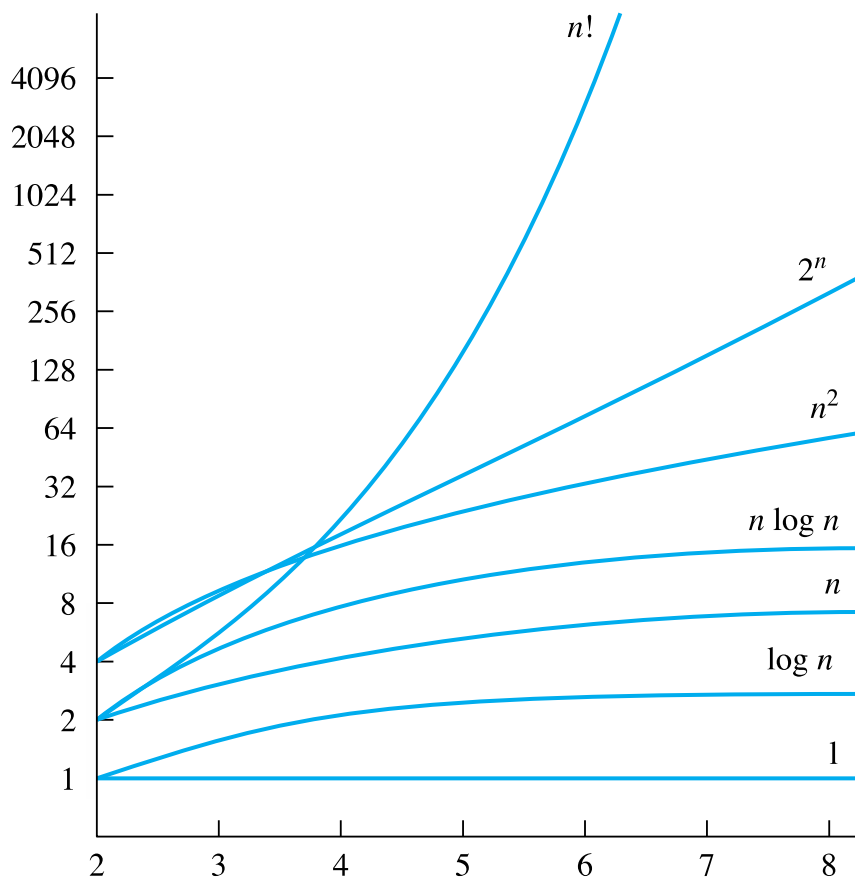
# 常见阶

- $\Theta$ 等价类:
  - Let  $A: \{f \mid f: \mathbb{N} \rightarrow \mathbb{R}^+\}$ , let  $s \in A / \Theta$
  - $\forall f, g \in s$ ,  $f$  is  $O(g)$  and  $g$  is  $O(f)$
- 一些常见的代表性阶:
  - $\Theta(1)$ ,  $\Theta(n)$ ,  $\Theta(n^2)$ ,  $\Theta(n^3)$ ,  $\Theta(\lg(n))$ ,  $\Theta(n \lg(n))$ , and  $\Theta(2^n)$

# 范例:

- 从低到高重新排列一下阶:
- $\Theta(1000n^2-n)$ ,  $\Theta(n^{0.2})$ ,  $\Theta(10000000)$ ,  $\Theta(1.3^n)$ ,  
 $\Theta(n+10^7)$ ,  $\Theta(n\lg(n))$ 
  - $\Theta(10000000)$
  - $\Theta(n^{0.2})$
  - $\Theta(n+10^7)$
  - $\Theta(n\lg(n))$
  - $\Theta(1000n^2-n)$
  - $\Theta(1.3^n)$ ,

# 函数增长速度

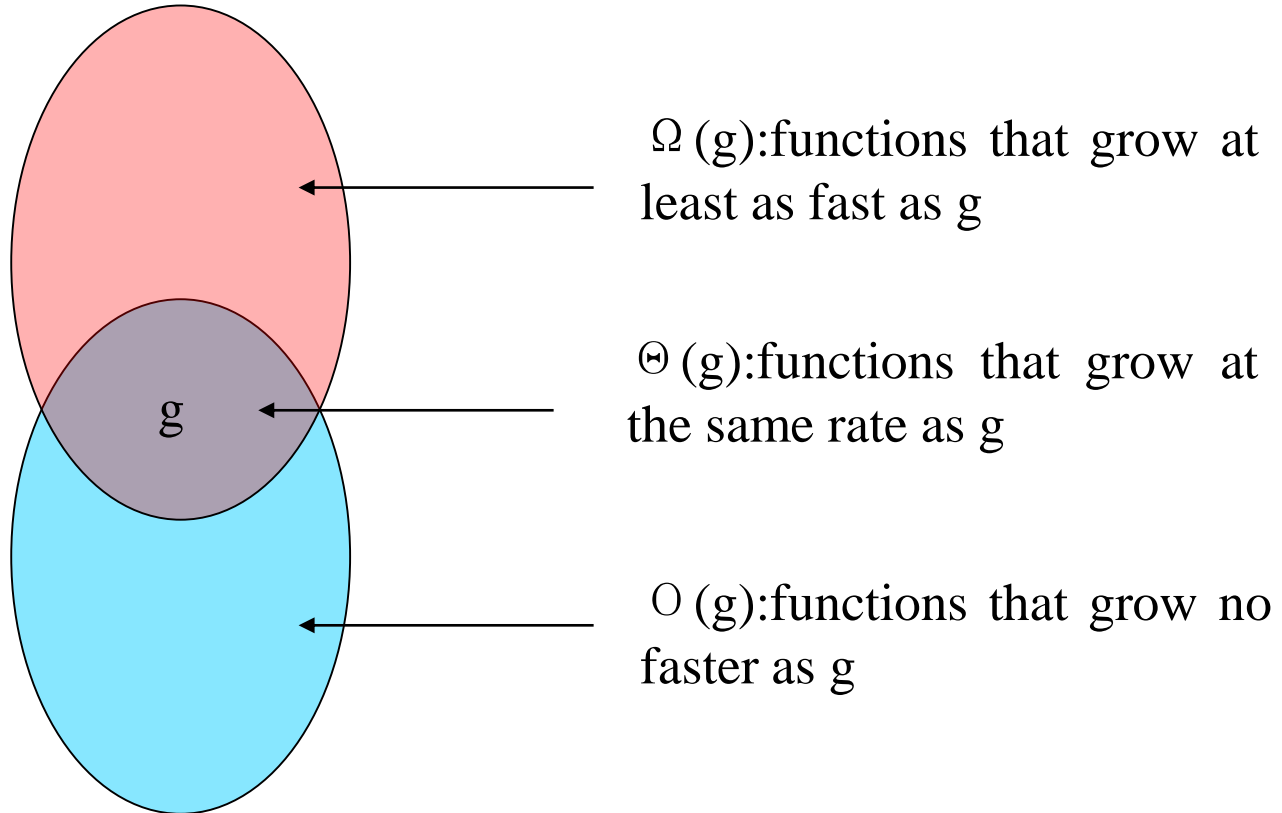


注意纵坐标乃是对数刻度



# 相对增长速度

给定函数  $g$ :





# 教材和练习

- 练习:
  - 第六版
    - P349: 24; 36
    - P360: 4(a,b,c,d)
  - 第七版
    - P433: 8; 20
    - P442: 4(a,b,c,d)