

1 Preliminaries

```
1 void X_Sort ( ElementType A[ ], int N )
```

2 Insertion Sort

```
1 void InsertionSort ( ElementType A[ ], int N )
2 {
3     int j, P;
4     ElementType Tmp;
5
6     for ( P = 1; P < N; P++ ) {
7         Tmp = A[ P ]; /* the next coming card */
8         // 默认1-P已经排好了, 0是第一个, 根本不动
9         for ( j = P; j > 0 && A[ j - 1 ] > Tmp; j-- )
10             // 这里经常错是A[j-1] 和 tmp比较的!!!
11             A[ j ] = A[ j - 1 ];
12         // 如果前面一个还大于Tmp
13         /* shift sorted cards to provide a position for the new coming
14        card */
15         A[ j ] = Tmp; /* place the new card at the proper position */
16     } /* end for-P-loop */
17 }
```

$$T_{worst} = O(N^2)$$

(8)

$$T_{best} = O(N)$$

3 A Lower Bound for Simple Sorting Algorithms

- **【Definition】** An **inversion** 逆序对 in an array of numbers is any ordered pair (i, j) having the property that $i < j$ but $A[i] > A[j]$.

[[Example]] Input list 34, 8, 64, 51, 32, 21 has **9** inversions.

(34, 8) (34, 32) (34, 21) (64, 51) (64, 32) (64, 21) (51, 32) (51, 21) (32, 21)

There are **9** swaps needed to sort this list by insertion sort.

Swapping two adjacent elements that are out of place removes **exactly one** inversion.

$T(N, I) = O(I + N)$ where I is the number of inversions in the original array.

Fast if the list is **almost sorted**.

- **【Theorem】** The average number of inversions in an array of N distinct numbers is $N(N - 1)/4$. 平均的：最好的0 + 最坏的 $N(N - 1)/2$ 除以2
- **【Theorem】** Any algorithm that sorts by exchanging adjacent elements requires $\Omega(N^2)$ time on average. 任何算法只是交换相邻单元来排序，平均时间复杂度最好只能是 N^2 。Bubble sort、Insertion Sort这些都是。因为每次只消除一对逆序对。

4 Shellsort

4.1 Donald Shell

[[Example]] Sort:

	81	94	11	96	12	35	17	95	28	58	41	75	15
5-sort	35	17	11	28	12	41	75	15	96	58	81	94	95
3-sort	28	12	11	35	15	41	58	17	94	75	81	96	95
1-sort	11	12	15	17	28	35	41	58	75	81	94	95	96

- 先隔五个取一个数，进行Insertion Sort排序，消除了一些逆序对
- 再隔3个数，重复Insertion Sort，
- 上一轮的排序（消除的逆序对）可以保存下一轮
- 最后一步一定是 1-Sort，增量为1，退化成Insertion Sort
- 本质上就是Insertion Sort执行的时候每次就是就交换两个数，相当于一次消一个逆序对
- 而Shell Sort是隔着很多个去交换，“冥冥之中”消除了很多个逆序对
- 也有可能“冥冥之中”一个逆序对都没消除，那么就还是和Insertion sort一样的N平方的复杂度

```

1 void Shellsort( ElementType A[ ], int N )
2 {
3     int i, j, Increment;
4     ElementType Tmp;
5     for ( Increment = N / 2; Increment > 0; Increment /= 2 )
6         /*h sequence */
7         for ( i = Increment; i < N; i++ ) { /* insertion sort */
8             Tmp = A[ i ];
9             for ( j = i; j >= Increment; j -= Increment )
10                 if( Tmp < A[ j - Increment ] )
11                     A[ j ] = A[ j - Increment ];
12                 else
13                     break;
14             A[ j ] = Tmp;
15         } /* end for-I and for-Increment loops */
16 }

```

Worst - Case Analysis

【Theorem】 The worst-case running time of Shellsort, using Shell's increments, is $\Theta(N^2)$.

[[Example]] A bad case:

	1	9	2	10	3	11	4	12	5	13	6	14	7	15	8	16
8-sort	1	9	2	10	3	11	4	12	5	13	6	14	7	15	8	16
4-sort	1	9	2	10	3	11	4	12	5	13	6	14	7	15	8	16
2-sort	1	9	2	10	3	11	4	12	5	13	6	14	7	15	8	16
1-sort	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16



Pairs of increments are not necessarily relatively **prime**.
Thus the smaller increment can have little effect.

- 8 - Sort, 4 - Sort, 2 - Sort 什么事情都没做，只是在最后一轮把工作全做了
- Worst case就是Insertion Sort
- how to solve it: Shell Sort 中里面的increment 不要有公约数，不然容易出现上述的情况

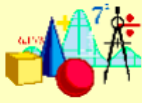
4.2 Hibbard's Increment Sequence

$$h_k = 2^k - 1 \quad (9)$$

- Hibbard提出的: 最坏 $\Theta(N^{3/2})$ ，最好 $O(N)$ ，平均 $O(N^{5/4})$

4.3 Sedgewick's Increment Sequence

【Theorem】 The worst-case running time of Shellsort, using Hibbard's increments, is $\Theta(N^{3/2})$.



Conjectures:

$$T_{\text{avg-Hibbard}}(N) = O(N^{5/4})$$

Sedgewick's best sequence is $\{1, 5, 19, 41, 109, \dots\}$ in which the terms are either of the form $9 \times 4^i - 9 \times 2^i + 1$ or $4^i - 3 \times 2^i + 1$. $T_{\text{avg}}(N) = O(N^{7/6})$ and $T_{\text{worst}}(N) = O(N^{4/3})$.

Shellsort is a very simple algorithm, yet with an extremely complex analysis. It is good for sorting up to moderately large input (tens of thousands).

- Sedgewick提出的: 最坏 $\Theta(N^{4/3})$, 最好 $O(N)$, 平均 $O(N^{7/6})$

5 Heapsort

```

1 void Heapsort( ElementType A[ ], int N )
2 {   int i;
3     for ( i = N / 2; i >= 0; i -- ) /* BuildHeap */
4         PercDown( A, i, N );
5     for ( i = N - 1; i > 0; i -- ) {
6         Swap( &A[ 0 ], &A[ i ] ); /* DeleteMax */
7         PercDown( A, 0, i );
8     }
9 }
```

- 是建一个大顶堆，目的是每次换下去，就会把目前最大的扔到目前的最后面
- 这种方法会比再建一个 `Tmp[N]` 会省一倍空间
- 注意：现在从0单元开始，0单元也存数据，child也需要改变
- 【Theorem】 The average number of comparisons used to heapsort a random permutation of N distinct items is

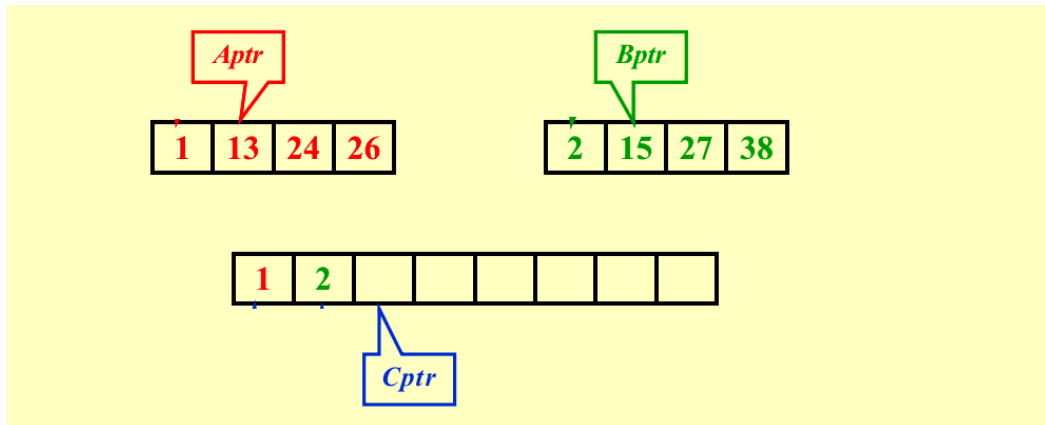
$$T_{\text{avg}} = 2N \log N - O(N \log \log N) \quad (10)$$

- Note: Although Heapsort gives the best average time, in practice it is slower than a version of Shellsort that uses Sedgewick's increment sequence.
- 实际中 Shellsort 会比 Heapsort 快，因为 Heapsort 交换的次数非常多

6 MergeSort

6.1 Merge two sorted lists

这一步是将两个已经排好序的小数组合并成一个大数组



$$T(N) = O(N)$$

(11)

6.2 Mergesort

```

1 void Mergesort( ElementType A[ ], int N )
2 {   ElementType *TmpArray; /* need O(N) extra space */
3     TmpArray = malloc( N * sizeof( ElementType ) );
4     if ( TmpArray != NULL ) {
5         MSort( A, TmpArray, 0, N - 1 );
6         free( TmpArray ); // Space can be recovered
7     }
8     else FatalError( "No space for tmp array!!!" );
9 }
10
11 void MSort( ElementType A[ ], ElementType TmpArray[ ], int Left, int
12 Right )
13 {   int Center;
14     if ( Left < Right ) { /* if there are elements to be sorted */
15         Center = ( Left + Right ) / 2;
16         MSort( A, TmpArray, Left, Center );           /* T( N / 2 ) */
17         MSort( A, TmpArray, Center + 1, Right );       /* T( N / 2 ) */
18         Merge( A, TmpArray, Left, Center + 1, Right ); /* O( N ) */
19     }
20 }
```

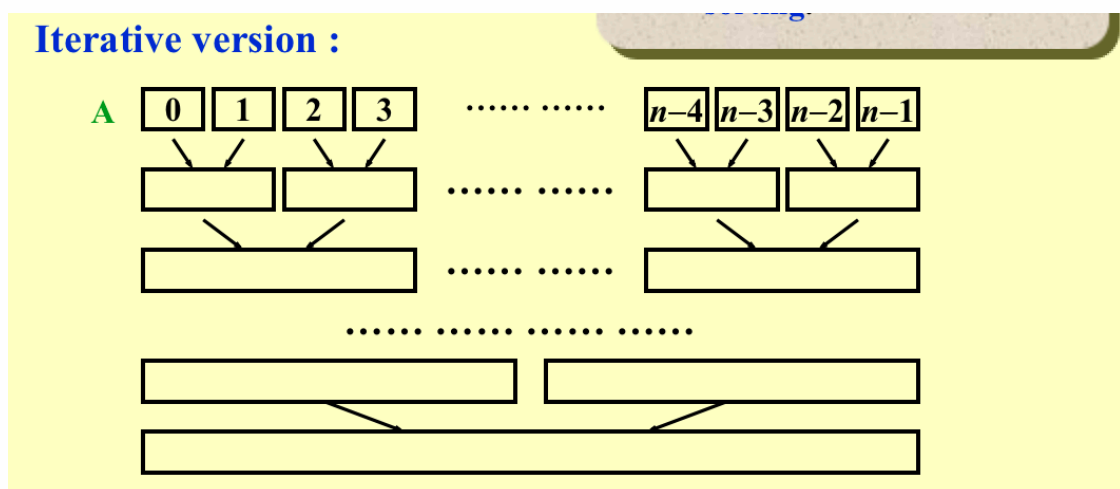
```

19 }
20
21 /* Lpos = start of left half, Rpos = start of right half */
22 void Merge( ElementType A[ ], ElementType TmpArray[ ], int Lpos, int
Rpos, int RightEnd )
23 {   int i, LeftEnd, NumElements, TmpPos;
24     LeftEnd = Rpos - 1;
25     TmpPos = Lpos;
26     NumElements = RightEnd - Lpos + 1;
27     while( Lpos <= LeftEnd && Rpos <= RightEnd ) /* main loop */
28         /* 不管谁先到底，只要到底，就退出 */
29         if ( A[ Lpos ] <= A[ Rpos ] )
30             TmpArray[ TmpPos++ ] = A[ Lpos++ ];
31         else
32             TmpArray[ TmpPos++ ] = A[ Rpos++ ];
33
34     // 下面两步就是把没排好的加到进去
35     while( Lpos <= LeftEnd ) /* Copy rest of first half */
36         TmpArray[ TmpPos++ ] = A[ Lpos++ ];
37     while( Rpos <= RightEnd ) /* Copy rest of second half */
38         TmpArray[ TmpPos++ ] = A[ Rpos++ ];
39
40     for( i = 0; i < NumElements; i++, RightEnd - - )
41         /* Copy TmpArray back */
42         A[ RightEnd ] = TmpArray[ RightEnd ];
43 }

```

- 如果 Msort 中每次的 TmpArray 都会被动态分配（每次完都会回收）， $S(N) = (N \log N)$

$$T(N) = O(N + N \log N) \quad (12)$$



- Note: **Mergesort requires linear extra memory, and copying an array is slow.** It is hardly ever used for internal sorting, but is quite useful for external sorting.

7 Quicksort

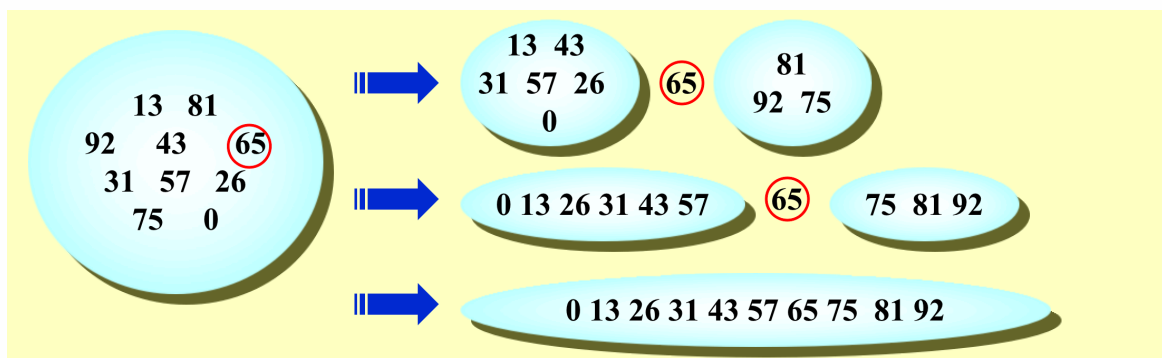
The fastest known sorting algorithm in practice

7.1 The algorithm

```

1 void Quicksort ( ElementType A[ ], int N )
2 {
3     if ( N < 2 ) return;
4     pivot = pick any element in A[ ];
5     Partition S = { A[ ] \ pivot } into two disjoint sets:
6     A1={ a 属于 S | a <= pivot } and A2={ a 属于 S | a >= pivot };
7     A = Quicksort ( A1, N1 ) U { pivot } U Quicksort ( A2, N2);
8 }

```



- The best case $T(N) = O(N \log N)$

7.2 Picking the Pivot

☞ **A Wrong Way: $\text{Pivot} = A[0]$**

The worst case: $A[]$ is **presorted** – quicksort will take $O(N^2)$ time to do **nothing** 😞

☞ **A Safe Maneuver: $\text{Pivot} = \text{random select from } A[]$**

😞 random number generation is **expensive**

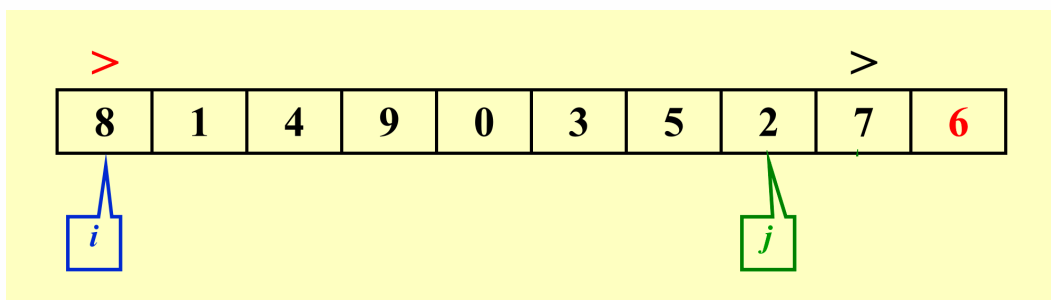
☞ **Median-of-Three Partitioning:**

$\text{Pivot} = \text{median}(\text{left}, \text{center}, \text{right})$

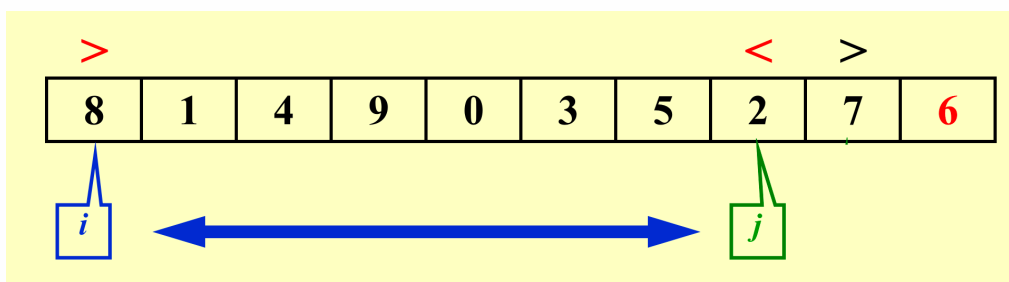
Eliminates the bad case for sorted input and actually reduces the running time by about 5%.

- ✗ 选第一个作为Pivot，其实不好，如果遇到排好了的sorted list，那么就要花费 $O(N^2)$ 的时间
- ✗ 那随机数呢：随机数的产生花时间
- ☑ 取中位数：取最左边，最右边，中间的中位数

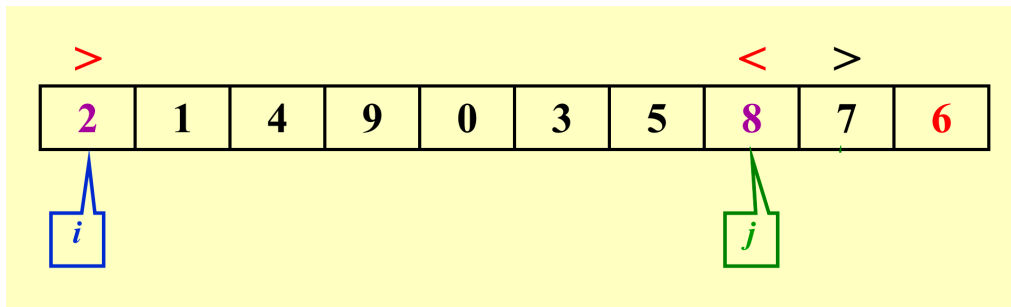
7.3 Partitioning Strategy



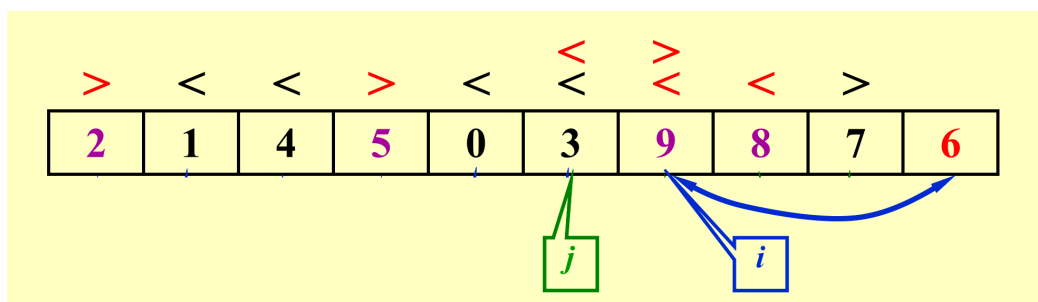
- 先选好pivot，从最左边和最右边（pivot-1的位置）



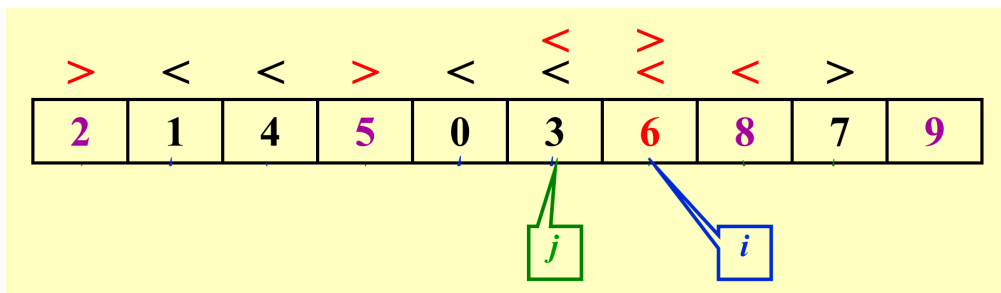
- i指针判断当前值是否小于pivot，如果大于，i停止
- j指针判断当前值是否大于pivot，如果小于，j停止



- 两个指针停止后，交换两者元素



- 继续这样做，这样交换，直到i和j已经交汇



- 此时交换i的元素和Pivot
- 思考一下：也就是i踏足过的地方，都小于pivot
- j踏足过的地方都大于pivot
- 那么就消除了很多逆序对
- 每run一次，就有一个位置的数据到了它的final位置，可以用此性质判断到了第几次或至多几次

7.4 Small Arrays

Problem: Quicksort is slower than insertion sort for small N (≤ 20).

Solution: Cutoff when N gets small (e.g. $N = 10$) and use other efficient algorithms (such as insertion sort).

7.5 Implementation

考试要求

```

1 void Quicksort( ElementType A[ ], int N )
2 {
3     Qsort( A, 0, N - 1 );
4     /* A:   the array   */
5     /* 0:   Left index  */
6     /* N - 1: Right index */
7 }

```

```

1  /* Return median of Left, Center, and Right */
2  /* Order these and hide the pivot */
3
4  ElementType Median3( ElementType A[ ], int Left, int Right )
5  {
6      int Center = ( Left + Right ) / 2;
7
8      if ( A[ Left ] > A[ Center ] )
9          Swap( &A[ Left ], &A[ Center ] );
10
11     if ( A[ Left ] > A[ Right ] )
12         Swap( &A[ Left ], &A[ Right ] );
13
14     if ( A[ Center ] > A[ Right ] )
15         Swap( &A[ Center ], &A[ Right ] );
16     // 实际上三个比较, 把最大的数换到最右边
17     // center 是 中位数
18
19     /* Invariant: A[ Left ] <= A[ Center ] <= A[ Right ] */
20     Swap( &A[ Center ], &A[ Right - 1 ] ); /* Hide pivot */
21     /* only need to sort A[ Left + 1 ] ... A[ Right - 2 ] */
22
23     return A[ Right - 1 ]; /* Return pivot */
24 }

```

```

1 void Qsort( ElementType A[ ], int Left, int Right ) // 考到几率很大
2 { int i, j;
3   ElementType Pivot;
4   if ( Left + Cutoff <= Right ) { /* if the sequence is not too
short */
5     // 如果太短了的话, 直接去Insertion Sort
6     Pivot = Median3( A, Left, Right ); /* select pivot */
7
8     i = Left;    j = Right - 1; /* why not set Left+1 and Right-
2? */
9
10    for( ; ; ) {
11      // 一次最少能消除2对逆序对
12
13      while ( A[ ++i ] < Pivot ) { } /* scan from left , i 指针扫
描*/
14      while ( A[ --j ] > Pivot ) { } /* scan from right , j 指针扫
描*/
15
16      if ( i < j ) // i >= j 说明已经已经完全scan了
17        Swap( &A[ i ], &A[ j ] ); /* adjust partition */
18      else break; /* partition done */
19
20    }
21
22    Swap( &A[ i ], &A[ Right - 1 ] ); /* restore pivot */
23    // Pivot 不需要再排
24    Qsort( A, Left, i - 1 ); /* recursively sort left part */
25    Qsort( A, i + 1, Right ); /* recursively sort right part */
26
27    } /* end if - the sequence is long */
28    else /* do an insertion sort on the short subarray */
29      // 数组长度过短, 执行Insertion Sort
30      InsertionSort( A + Left, Right - Left + 1 );
31  }

```

- QSort每次一定能排对一个

7.6 Analysis

$$T(N) = T(i) + T(N - i - 1) + cN$$

☞ **The Worst Case:**

$$T(N) = T(N - 1) + cN \rightarrow T(N) = O(N^2)$$

☞ **The Best Case:** [... ...] • [... ...]

$$T(N) = 2T(N/2) + cN \rightarrow T(N) = O(N \log N)$$

☞ **The Average Case:**

Assume the average value of $T(i)$ for any i is $\frac{1}{N} \left[\sum_{j=0}^{N-1} T(j) \right]$

$$T(N) = \frac{2}{N} \left[\sum_{j=0}^{N-1} T(j) \right] + cN \rightarrow T(N) = O(N \log N)$$

[[Example]] Given a list of N elements and an integer k . Find the k th largest element.

堆去做；

QuickSort - Q Select：判断 k 和 i 的关系，就能确定比 i 大还是比 i 小

求中位数可以得到线性复杂度

8 Sorting Large Structures

Problem: Swapping large structures can be very much expensive.

Solution: Add a pointer field to the structure and swap pointers instead – indirect sorting.

Physically rearrange the structures at last if it is really necessary.

[[Example]] **Table Sort**

list	[0]	[1]	[2]	[3]	[4]	[5]
key	d	b	f	c	a	e
table	0	1	2	3	4	5

- 首先建一个table，里面代表了Key

[[Example]] Table Sort

list	[0]	[1]	[2]	[3]	[4]	[5]
key	d	b	f	c	a	e
table	4	1	3	0	5	2

- 然后根据Key对table进行排序：4-a 1-b 3-c 0-d 5-e 2-f

Note: Every permutation is made up of disjoint cycles.

list	[0]	[1]	[2]	[3]	[4]	[5]
key	d	b	f	c	a	e
table	4	1	3	0	5	2

temp = d
current = 0
next = 4

- 但是我还想物理上也排好
- 就采用如上的算法，current代表目前的位置，next代表真正所指数据存储空间

Note: Every permutation is made up of disjoint cycles.

list	[0]	[1]	[2]	[3]	[4]	[5]
key	a	b	f	c	a	e
table	0	1	3	0	5	2

temp = d
current = 4
next = 5

- 找到next = 4代表的list[next] = a，然后换到list[current] = list[0] 的位置
- 然后 current = next, next = list[current]

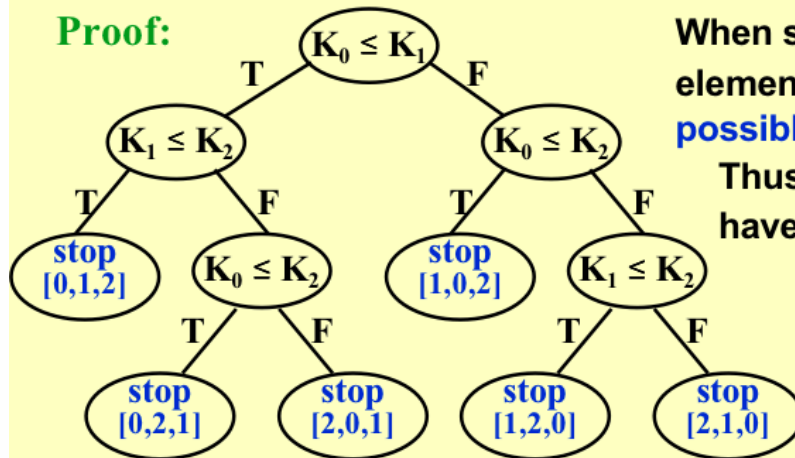
In the worst case there are $\lfloor N/2 \rfloor$ cycles and requires $\lfloor 3N/2 \rfloor$ record moves.

$T = O(m N)$ where m is the size of a structure.

9 A General *Lower Bound* for Sorting

【Theorem】 Any algorithm that **sorts by comparisons only** must have a worst case computing time of $\Omega(N \log N)$.

Proof:



When sorting N distinct elements, there are $N!$ **different possible results**.

Thus any decision tree must have at least $N!$ **leaves**.

If the height of the tree is k , then $N! \leq 2^{k-1}$ (# of leaves in a complete binary tree)

$$\Rightarrow k \geq \log(N!) + 1$$

Decision tree for insertion sort on R_0, R_1 , and R_2

Since $N! \geq (N/2)^{N/2}$ and $\log_2 N! \geq (N/2)\log_2(N/2) = \Theta(N \log_2 N)$

Therefore $T(N) = k \geq c \cdot N \log_2 N$. ■

- 非叶节点都在做比较，叶节点是排序结果
- 这么多叶节点，只有一个是对的
- 这里说的是基于比较的算法，最坏的情况下也只需要走 $O(N \log N)$

$$T_{\text{based on comparison}} = \Omega(N \log N) \quad (13)$$

10 Bucket Sort and Radix Sort

👉 Bucket Sort

【Example】 Suppose that we have N students, each has a grade record in the range 0 to 100 (thus there are $M = 101$ possible distinct grades). How to sort them according to their grades in **linear** time?

- 设一个list（开辟一堆桶），有一个数进来就扔到对应的桶里

```

1 Algorithm
2 {
3     initialize count[ ];
4     while (read in a student's record)
5         insert to list count[stdnt.grade];
6     for (i=0; i<M; i++) {
7         if (count[i])
8             output list count[i];
9     }
10 }

```

$$T(N, M) = O(N + M) \quad (14)$$

[[Example]] Given $N = 10$ integers in the range 0 to 999 ($M = 1000$)
Is it possible to sort them in **linear** time?

☞ Radix Sort

Input: 64, 8, 216, 512, 27, 729, 0, 1, 343, 125

Sort according to the **Least Significant Digit** first.

Bucket	0	1	2	3	4	5	6	7	8	9
Pass 1	0	1	512	343	64	125	216	27	8	729
Pass 2	0	512	125		343		64			
	1	216	27							
	8		729							
Pass 3	0	125	216	343		512		729		
	1									
	8									
	27									
	64									

Output: 0, 1, 8, 27, 64, 125, 216, 343, 512, 729

What if we sort
according to the **Most
Significant Digit** first?

$T = O(P(N+B))$
where P is the
number of
passes, N is the
number of
elements to sort,
and B is the
number of
buckets.

- KeyPoint: Sort according to the Least Significant Digit first.
- 第一轮根据个位来装桶
- 第二轮根据十位来装桶
- 第三轮根据百位来装桶

Suppose that the record R_i has r keys.

$K_i^j ::=$ the j -th key of record R_i

$K_i^0 ::=$ the **most** significant key of record R_i

$K_i^{r-1} ::=$ the **least** significant key of record R_i

A list of records R_0, \dots, R_{n-1} is **lexically sorted** with respect to the keys K^0, K^1, \dots, K^{r-1} iff

$$(K_i^0, K_i^1, \dots, K_i^{r-1}) \leq (K_{i+1}^0, K_{i+1}^1, \dots, K_{i+1}^{r-1}), \quad 0 \leq i < n-1.$$

That is, $K_i^0 = K_{i+1}^0, \dots, K_i^l = K_{i+1}^l, K_i^{l+1} < K_{i+1}^{l+1}$ for some $l < r-1$.

[[Example]] A deck of cards sorted on 2 keys

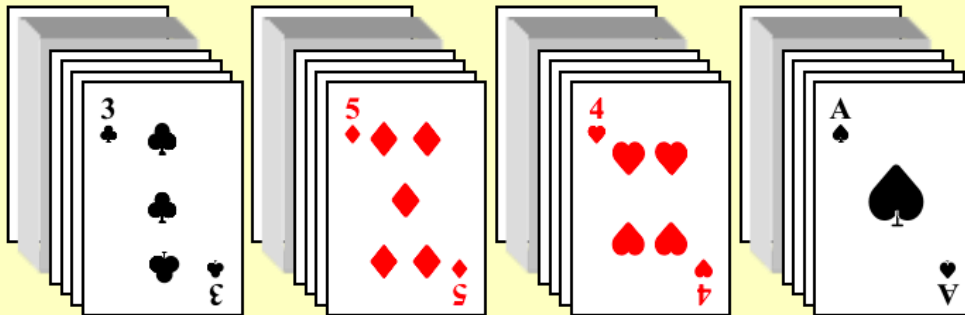
K^0 [Suit] ♣ < ♦ < ♥ < ♠

K^1 [Face value] 2 < 3 < 4 < 5 < 6 < 7 < 8 < 9 < 10 < J < Q < K < A

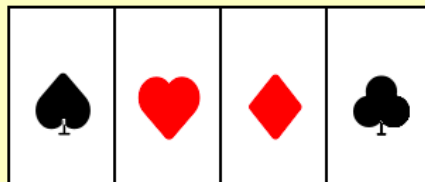
Sorting result : 2♣ ... A♣ 2♦ ... A♦ 2♥ ... A♥ 2♠ ... A♠

☞ MSD (**M**ost **S**ignificant **D**igit) Sort

① Sort on K^0 : for example, create 4 buckets for the suits

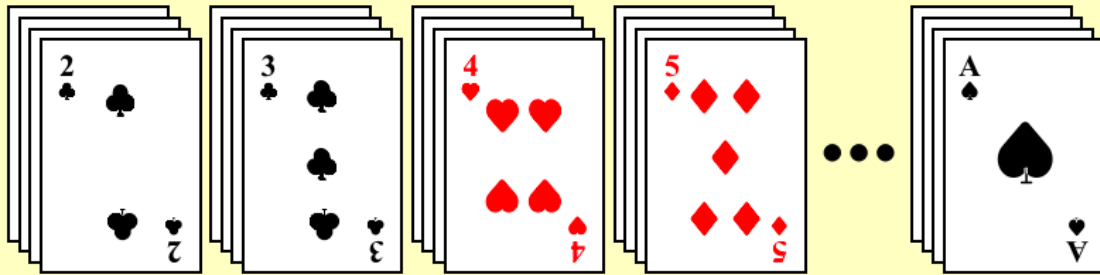


② Sort each bucket independently (using any sorting technique)



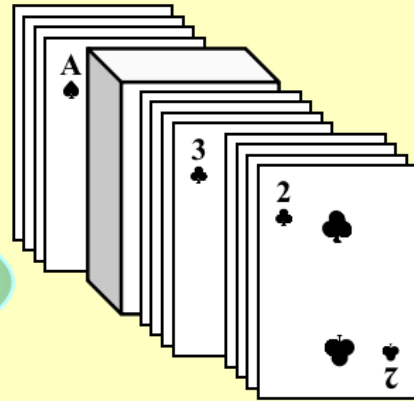
👉 LSD (Least Significant Digit) Sort

- ① Sort on K^1 : for example, create 13 buckets for the face values



- ② Reform them into a single pile

- ③ Create 4 buckets and resort



Question:
Is LSD always faster than MSD?

- LSD实际上执行两次桶排序