

Analysis of Simple Sorting Algorithms

SelectionSort and InsertionSort are among the simplest sorting methods and have straight forward analysis of running time. For each, we will consider best case, worst case, and average case running times.

Simple Sorting 2

1

3

5

Selection Sort Example 12 12 2 4 7 9 12 7 9 2 4 7 4 12 9 7 Simple Sorting

SelectionSort

Algorithm SelectionSort (arr)
Input Array arr
Output elements in arrare in sorted order

for i ← 0 to arr.length - 2 do
min ← arr[i]
minIndex ← i
for j ← i + 1 to arr.length - 1 do // find next smallest element
if arr[j] < min then
min ← arr[j]
minIndex ← j
if i!= minIndex then
swapElements(arr, i, minIndex)

Algorithm swapElements(arr, i, j)
temp ← arr[i]
arr[i] ← arr[j]
arr[i] ← temp

4

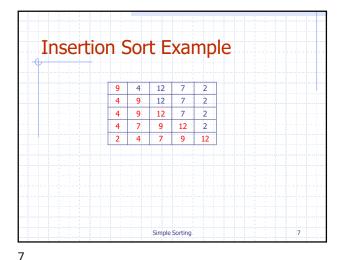
6

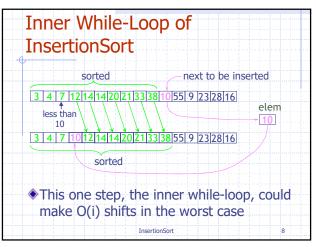
### Analysis of SelectionSort

- If n is the number of items in the array, there are n-1 comparisons on the first pass, n-2 on the second, and so on. The formula for the sum of such a series is: (n-1) + (n-2) + (n-3) + ... + 1 = n\*(n-1)/2 Thus, the algorithm makes  $\Theta(n^2)$  comparisons.
- With n items, SelectionSort performs no more than n swaps. For large values of n, the comparison times will dominate, so we have to say that the SelectionSort runs in Θ(n²) time.

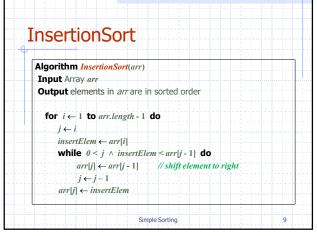
Simple Sorting 5

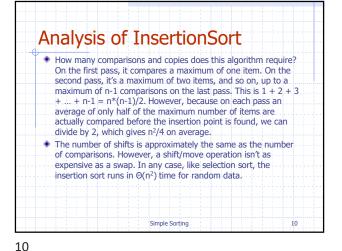
9





8





# Analysis of InsertionSort Best-Case Analysis. The best case for InsertionSort occurs when the input array is already sorted. In this case, the condition in the inner while loop always fails, so the code inside the loop never executes. The result is that execution time inside each outer loop is constant, and so running time is O(n).

Analysis of InsertionSort

Norst-Case Analysis. Since there are two loops, nested, even in the worst case, the running time is only Θ(n²). The worst case for InsertionSort occurs when the input array is reverse-sorted. In this case, in pass #i of the outer for loop the inner while loop must execute all its statements i times approximately, and so execution time is proportional to 1+2+...+n−1=Θ(n²). Therefore, worst-case running time is Θ(n²).

# Analysis of InsertionSort • Average-Case Analysis. It is reasonable to expect that typically, the inner while loop will not work as hard as it does in the worst-case. As mentioned earlier, on average there are n<sup>2</sup>/4 comparisons. So on average, InsertionSort runs in $\Theta(n^2)$ .

Comparing Performance of Simple Sorting Algorithms

- Swaps are more expensive than shifts/moves. Notice that swaps are involve roughly eight primitive operations. This is more costly than shifting (which takes about five).
- Also, insertion sort does, on average, half as many key comparisons. Demos give empirical data for comparison.
- BubbleSort performs (on average) Θ(n²) swaps whereas SelectionSort performs only O(n) swaps, and InsertionSort does not perform any swaps at all (it shifts right which takes about half as much time as a swap). This difference explains why BubbleSort is so much slower than the other two. (Empirical studies show BubbleSort is 5 times slower than InsertionSort and 40% slower than SelectionSort and that InsertionSort is 3.5 times faster that SelectionSort on average.)

13

14

16

### Main Point 1. Using the tools of asymptotic analysis, we find that, in the worst case, SelectionSort and InsertionSort run in O(n2) time, so performance of both algorithms is about the same (i.e., asymptotically equivalent). A finer analysis, which computes the number of comparisons and swaps (SelectionSort) versus comparisons and shifts (InsertionSort) performed by each algorithm, provides an account for why InsertionSort is 3.5 times faster than SelectionSort. Science of Consciousness. This analysis illustrates the principle that deeper levels of intelligence enable one to have greater insight and greater mastery over the more expressed values of life.

Simple Sorting

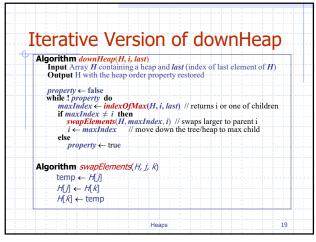
Building the Heap Example

15

HeapSort Algorithm heapsort(arr) Input Array arr Output elements in arr are in sorted order buildHeap (arr) // build the heap from bottom up O(n) end  $\leftarrow arr$ .length-1 while end > 0 do swapElements(arr, 0, end) // move max to end of heap O(n) end  $\leftarrow$  end - 1 // decrease size of the heap O(n)downHeap(arr, 0, end) // restore heap-order O(n log n) Simple Sorting

Build the Heap from bottom Algorithm buildHeap(arr) Input Array arr Output arr is a heap built from the bottom up in O(n) time with the root at index 0 (instead of 1) last ← arr.length-1; next ← last; while (next > 0) do downHeap(arr, parent(next), last); next ← next - 2; Algorithm parent(i) return floor((i-1)/2)Simple Sorting 18

17 18



Helper for downHeap Algorithm

Algorithm indexOfMax(A, r, last)
Input array A, an index r (referencing an element of A), and last, the index of the last element of the heap stored in A

Output index of element in A containing the largest of r or r's children

largest ← r

left ← 2\*r + 1

right ← left + 1

if left ≤ last ∧ A[left] > A[largest] then

largest ← left

if right ≤ last ∧ A[right] > A[largest] then

largest ← right

return largest

20

19

BubbleSort

Algorithm BubbleSort(arr)  $n \leftarrow arr.length$ for  $i \leftarrow 0$  to n-1 do

for  $j \leftarrow 0$  to n-i-2 do

if arr[j] > arr[j+1] then swapElements(arr, j, j+1)Algorithm swapElements(arr, i, j)  $temp \leftarrow arr[i]$   $arr[i] \leftarrow arr[j]$   $arr[j] \leftarrow temp$ Simple Sorting 21

Analysis of BubbleSort

❖ In general, if n is the number of items in the array, the algorithm makes n-1 comparisons on each ith run. So there are total n\*(n-1) = Θ(n²) comparisons.

❖ There are fewer swaps than there are comparisons because two elements are swapped only if they need to be. If the data is random, a swap is necessary about half the time on average, so there will be about Θ(n²) swaps.

21 22

## "Every Case" Analysis

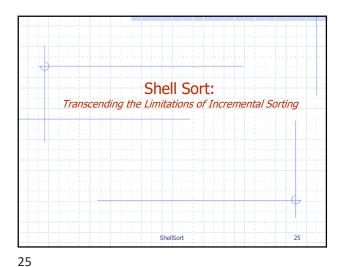
- Best case for BubbleSort occurs when input is already sorted. In that case, no swaps are performed. Still, because there are nested loops, both depending on n, running time even in this case is Θ(n²).
- The worst case for BubbleSort occurs when input array is in reverse sorted order. In that case, the maximum number of swaps are performed. But even in the worst case, since each swap requires only constant time, the analysis is the same -running time is O(n²).
- For BubbleSort, asymptotic running time in the best, average and worst case are the same. As expected, empirical tests have shown, that BubbleSort exhibits slightly faster times on sorted or nearly sorted inputs, and slower times on inputs in reverse order.

Possible Improvements

- It is possible to implement BubbleSort slightly differently so that in the best case (which means here that the input is already sorted), the algorithm runs in Θ(n) time. (Exercise)
- As the algorithm shows, at the end of iteration i, the values in arr[n-i-1] through arr[n-1] are in final sorted order. This observation can be used to shorten the inner loop. The result is to cut the running time in half (though it must still be  $\Theta(n^2)$ ). (Exercise)

Simple Sorting 24

24



ShellSort

- Formulated by Donald Shell, who named the sorting algorithm after himself in 1959.
- A sorting algorithm based on InsertionSort.
- Much faster than the O(n²) sorts like SelectionSort and InsertionSort.
- Good for medium-sized arrays (as is InsertionSort generally), perhaps up to a few thousand items

ShellSort 26

26

Problem with InsertionSort:

Too Many Shifts

sorted

next to be inserted

3 | 4 | 7 | 12|14|14|20|21|33|38|10|55| 9 |23|28|16|
less than
10
3 | 4 | 7 | 10|12|14|14|20|21|33|38|55| 9 |23|28|16|

sorted

This one step possibly makes more shifts than necessary.

Problem of InsertionSort: Too Many Shifts

- Suppose a small item is on the far right. To move this small item to its proper place on the left, all the intervening items (between the place where it is and where it should be) must be shifted one space to the right. If there are i intervening items, this step takes close to i copies to handle one item. If i is close to n, then it takes O(n) to put just one item to the proper place.
- This performance could be improved if we could somehow move a smaller item many spaces to the left without shifting all the intermediate items individually.

ShellSort 28

27

28

ShellSort — General Description

\* Essentially a segmented InsertionSort

• Divides an array into several smaller noncontiguous segments

• The distance between successive elements in one segment is called a gap/Increment (usually represented by h).

• Each segment is sorted within itself using InsertionSort.

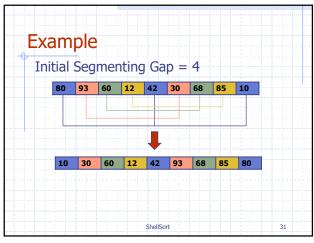
• Then re-segment into larger segments (smaller gaps) and repeat sort.

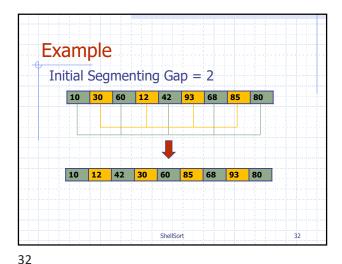
• Continue until only one segment (h= 1).

Sorting nonconsecutive subarrays

Here is an array to be sorted (numbers aren't important)

- Consider just the red locations.
- We try doing insertion sort on just the red numbers, as if they were the only ones in the array.
- Next do the same for just the yellow locations -- we do an insertion sort on just these numbers.
- Now do the same for each additional group of numbers.
- The resultant array is sorted within groups, but not overall.





31

Example Initial Segmenting Gap = 1 10 12 42 30 60 85 68 93 80 10 12 30 42 60 68 80 85 93 ShellSort

Diminishing Gaps and N-Sorting

- In the example, we have seen an initial interval/gap of 4 cells for sorting a 9-cell array. This means that all items spaced four cells apart are sorted among themselves. We call it 4-sort. In general, applying InsertionSort on gap of N cells is called N-Sorting.
- The interval is then repeatedly reduced until it
- ◆ The set of intervals used in the example, (4, 2, 1) is called the interval sequence or gap sequence.
- Using this gap sequence, we can also say we did 4sort, 2-sort, and 1-sort on the example.

33

Obtaining a Gap Sequence

- Any decreasing gap sequence will work (if the last gap is 1), but the running time depends crucially on the choice of the gap sequence.
- When the gap sequence consists of powers of 2, such as (8, 4, 2, 1) (this was Shell's original method) it can be shown that the worst-case running time is no better than InsertionSort: O(n2). Running time is improved when terms of the gap sequence are relatively prime (no common factors other than 1).

(h-1) / 3 121 364

gaps.

Added Gap Sequence

Donald Knuth, in his discussion of Shell's

 $h_0 = 1$ ,  $h_{i+1} = h_i * 3 + 1$ 

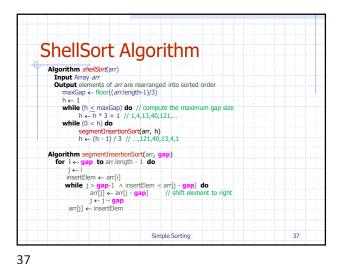
Sort, recommended another sequence of

■ Find the largest h<sub>i</sub> <= n, then start with h<sub>i</sub>

34

For example, sorting a 1,000-element array, first needs to find a largest h <= n, which will be 364 in this case. Then, reduce the interval using the inverse of the formula given: h = (h-1)/3This inverse formula generates the reverse sequence 364, 121, 40, 13, 4, 1.

36



Running time

- Real running time of Shellsort? Although running times for ShellSort using certain gap sequences are known, finding the gap sequence that produces the best possible running time is still being researched.
- For any version of ShellSort, we do know that its average running time is O(n<sup>r</sup>) with 1 < r < 2</li>
- ◆ Generally speaking, ShellSort's running time is better than O(n²) but worse than O(nlog n).

38

Ideal Gap Sequence Although mathematical techniques have been developed to optimize the gap sequence used, the best gap sequences have been found just by empirical tests. Here are a few of the best known results [see https://en.wikipedia.org/wiki/Shellsort] time complexity publication  $\left\lfloor \frac{N}{2} \right\rfloor, \left\lfloor \frac{N}{4} \right\rfloor, \dots, 1$  $\Theta(N^2)$  [when  $N=2^p$ ] Shell, 1959[3] Frank &  $2\left|\frac{N}{4}\right| + 1, \dots, 3, 1$ Lazarus 1960<sup>[7]</sup>  $\Theta(N^{3/2})$ 1, 3, 7, 15, 31, 63, . . .  $\Theta(N^{3/2})$ 1963[8] Papernov & Stasevich, 1965<sup>[9]</sup> 1, 3, 5, 9, 17, 33, 65, . . .  $\Theta(N^{3/2})$ Pratt, 1971<sup>[10]</sup> 1, 2, 3, 4, 6, 8, 9, 12, . . .  $\Theta(N \log^2 N)$ Pratt, 1971<sup>[10]</sup>  $1, 4, 13, 40, 121, \dots$  $\Theta(N^{3/2})$ 

Main Point

2. The first algorithm to overcome the limitations of the simple sorting algorithms – BubbleSort, SelectionSort, Insertion Sort – was ShellSort. The strategy used in ShellSort was to remove one of the known limitations of the InsertionSort algorithm. The technique results in a significant jump in performance. Science of Consciousness: This step in the history of sorting algorithms illustrates the general principle that removal of blockages to optimal functioning of a system can greatly improve its performance. This is the strategy used by TM, which results in removal of stress and significant improvements in performance in life: intelligence, efficiency, satisfaction.

Simple Sort

Summary of
Sorting Algorithms

Algorithm
Time

39

Algorithm	Time	Notes (pros & cons)
selection-sort	$O(n^2)$	Okay but slow even on small inputs (<1K)
insertion-sort	$O(n^2)$ or $O(n+k)$	excellent for small inputs, fastest for 'almost' sorted
heap-sort	$O(n \log n)$	in-place, fast, excellent for large inputs (1K to M)
Shell-sort	$O(n^{3/2})$	in-place, fast, excellent for large inputs (1K to M)

40

Efficient

InsertionSort on List

Algorithm InsertionSort(Lst)
Input list Lst
Output elements in Lst are in sorted order

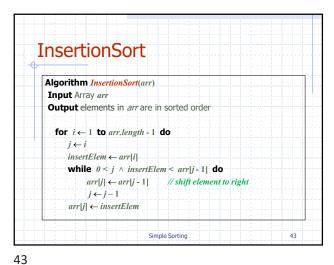
if Lst.istce() < 2 then return

iter ← Lst.positions()
next ← iter.nextObject()
while iter.husNext() do
prev ← next
next ← iter.nextObject()
insertElem ← next.element()
curr ← next
while! Lst.isFirst(curr) ∧ insertElem < prev.element() do

Lst.replaceElement(next, prev.element()) // shift element to right
curr ← prev
if ! Lst.isFirst(prev) then prev ← Lst.before(prev)

Lst.replaceElement(next, insertElem)

Simple Sorting 42



**Connecting the Parts of Knowledge** With the Wholeness of Knowledge Simple Sorting Insertion Sort sorts by examining each successive value x in the input list and searches the already sorted section of the array for the proper location for x. 2. ShellSort is also a sorting algorithm which does the same steps as InsertionSort, but, before carrying out those steps, performs a number of preprocessing steps, called *n-sorting*. The result of this refinement is that, even in the worst case, good versions of ShellSort run in  $O(n^r)$  for r < 2. 3. Transcendental Consciousness is the silent field of pure intelligence, the home of all knowledge, the basis of all activity. 4. Impulses within the Transcendental field. Contact with transcendental consciousness enlivens the support of the laws of nature for activity in life. Therefore, the "pre-processing" step necessary for success in life is *transcend*. Then activity will be smooth and successful. 5. Wholeness moving within itself. In Unity Consciousness, the transcendental level has already been automatically integrated with ordinary active awareness no "pre-processing" step is needed in this state.