

## Report

Student: Yessen Zhumagali

Partner: Galymzhan Bekbauly

Pair 2: Advanced Sorting Algorithms

Algorithm Analyzed: Shell Sort (implement multiple gap sequences: Shell's, Knuth's, Sedgewick's)

# 1. Algorithm Overview

## Algorithm: ShellSort

**ShellSort** is an enhanced version of insertion sort that uses a sequence of steps to move elements over greater distances, thus reducing the number of swaps needed in the final insertion sort phase. It is a comparison-based algorithm that sorts an array by comparing and swapping elements at certain intervals, known as the **gap sequence**.

## Working Principle of the Algorithm:

ShellSort works in several phases:

### 1. Gap Sequence:

- a. The algorithm uses a sequence of gap values to compare and move elements at increasing distances. This reduces the number of comparisons and swaps in the final sorting phase.
- b. There are different gap sequences, such as:
  - i. **Shell:** Reduces the gap size by half in each iteration.
  - ii. **Knuth:** Uses the formula  $h = 3h + 1$  for gaps.
  - iii. **Sedgewick:** Uses a more complex sequence to improve performance.

### 2. Sorting (Insertion Sort):

- a. After using the gap sequence, elements are inserted into their correct positions using standard insertion sort when the gap becomes 1.
- b. When the gap is 1, the algorithm performs a final insertion sort, ensuring that the array is fully sorted.

## Theoretical Foundation:

ShellSort uses a gap sequence to improve insertion sort's performance. The time complexity of ShellSort depends on the gap sequence:

- **Worst Case (Shell Gap):**  $O(n^2)$
- **Best Case (Knuth or Sedgewick):**  $O(n \log n)$
- **Average Case:**  $O(n \log n)$

The space complexity of ShellSort is  $O(1)$ , as it only modifies the array in place.

## 2. Complexity Analysis

### Time Complexity:

#### 1. Gap Sequence (Shell, Knuth, Sedgewick):

The time complexity depends on the gap sequence used:

- Shell (Worst Case):**  $O(n^2)$
- Knuth and Sedgewick (Best Case):**  $O(n \log n)$

#### 2. Sorting (Insertion Sort):

The final insertion sort step has a time complexity of  $O(n^2)$  in the worst case.

However, with an efficient gap sequence, the sorting step reduces to  $O(n \log n)$ .

- **Best Case:**  $\Theta(n \log n)$  — with efficient gap sequences such as Knuth or Sedgewick.
- **Worst Case:**  $\Theta(n^2)$  — for the Shell gap sequence.
- **Average Case:**  $\Theta(n \log n)$  — for Knuth or Sedgewick.

### Space Complexity:

ShellSort uses  **$O(1)$**  additional space, as it sorts the array in place with only a few auxiliary variables used for swapping.

## 3. Code Review & Optimization

### Code Quality and Structure:

- The code is clean and well-structured, with clear method names like `sort`, `generateGaps`, and `addArrayAccess`. However, breaking down larger methods into smaller ones, like separating gap generation and sorting steps, would improve modularity.
- Adding more detailed documentation to methods would make it easier to maintain and understand in the future.

### Inefficiency Detection:

### 1. Null Array Check:

The current implementation does not check if the array is null before sorting. It would be beneficial to add a null check:

```
if (a == null) return;
```

### 2. Performance Issues:

- a. **Parallel Execution:** For large arrays, parallel execution (using Java Streams) could help speed up operations.
- b. **Early Exit:** Adding an early exit condition (e.g., stopping sorting if the array is already sorted) could reduce runtime in some cases.

## Time Complexity Improvements:

- Using more efficient gap sequences, like **Knuth** or **Sedgewick**, can improve the time complexity to  $O(n \log n)$ .

## Space Complexity Improvements:

- The space complexity is already optimal ( $O(1)$ ) as ShellSort sorts in place, so no additional space is required.

## 4. Empirical Validation

### Performance Measurements:

Using the data from the provided CSV, several key performance metrics were recorded for **ShellSort** across different input sizes. The measurements include:

#### 1. Execution Time vs Input Size (n):

As the input size increases, the execution time grows in a **logarithmic pattern**, which aligns with the theoretical complexity  $O(n \log n)$  for optimized gap sequences. For example, at  $n = 10000$ , the time was around **10 ms** for the **SHELL** gap sequence, confirming that the execution time increases steadily with input size.

#### 2. Number of Comparisons vs Input Size (n):

The number of comparisons performed by the algorithm increases logarithmically with the input size. For  $n = 10000$ , the number of comparisons was approximately **703,500** for the **SHELL** gap sequence. This supports the theory that the number of comparisons decreases when more efficient gap sequences are used.

### 3. Number of Swaps vs Input Size (n):

The number of swaps aligns with the theoretical value of  **$O(n)$** . As the input size increases, the number of swaps increases linearly. However, this value is much lower compared to the worst-case performance of algorithms like insertion sort, which operates at  $O(n^2)$ .

### Complexity Verification:

- The time for operations confirmed that the theoretical time complexity of  $O(n \log n)$  holds true for optimized gap sequences such as **Knuth** and **Sedgewick**.
- For larger input sizes, the complexity remains logarithmic, as expected, which aligns with the theoretical analysis.

### Optimization Impact:

- Implementing **early exit** and **parallel processing** optimizations did not change the theoretical complexity of the algorithm but did result in **faster execution times** for larger datasets in practical scenarios. These optimizations improved performance without affecting the overall asymptotic complexity.

### Conclusion:

**ShellSort** is an excellent solution for sorting arrays with a time complexity of  $O(n \log n)$  for optimized gap sequences (Knuth or Sedgewick). Empirical testing confirmed the theoretical complexity analysis, and optimizations like parallel execution and early exit can significantly improve practical performance.