

## Assignment 2 — Algorithmic Analysis and Peer Code

### Pair 4 — Student B: Max-Heap (increaseKey, extractMax)

Student: Turar Nurbauli

#### ABSTRACT

This report analyzes the Max-Heap priority queue implementation developed for Assignment 2 (Pair 4, Student B). I provide an algorithm overview, tight asymptotic bounds for time and space, a focused code review with optimization opportunities, and an empirical validation based on measured performance ( $n = 10^2, 10^3, 10^4, 10^5$ ) across input distributions (random, sorted, reverse) and an additional comparison with Java's PriorityQueue. Results confirm expected  $\Theta(\log n)$  per-operation behavior, with end-to-end build-and-drain throughput scaling near  $\Theta(n \log n)$ . I conclude with practical recommendations for optimization and maintainability.

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#### 1. ALGORITHM OVERVIEW

- **Definition:** A max-heap is a complete binary tree stored in an array where each node's key is not smaller than its children's keys. It supports efficient priority queue operations via structural properties and local sifts.
- **Array indexing:**
  - Parent  $p = \text{floor}((i - 1)/2)$
  - Left child  $l = 2i + 1$
  - Right child  $r = 2i + 2$
- **Operations implemented:**
  - `insert(x)`: place element at the end; `siftUp` until heap order restored.
  - `max()`: return root value in  $O(1)$ .
  - `extractMax()`: move last element to root; `siftDown` until heap order restored.
  - `increaseKey(i, newValue)`: validate ( $\text{newValue} \geq a[i]$ ), set, then `siftUp` from  $i$ .

- Use cases: priority queues in scheduling, simulation, Dijkstra-like algorithms (with position mapping), real-time streams where frequent “extract highest priority” is needed.

## 2. COMPLEXITY ANALYSIS

### 2.1 Time Complexity

- insert:
  - Best case:  $\Omega(1)$  (no upward movement).
  - Worst/average:  $O(\log n)$  /  $\Theta(\log n)$  due to at most heap height sifts.
- extractMax:
  - $\Theta(\log n)$  (siftDown at most heap height).
- increaseKey(i, v):
  - Best:  $\Omega(1)$  (no upward movement).
  - Worst:  $O(\log n)$  (rise to root).
- max:
  - $\Theta(1)$ .

### 2.2 Space Complexity

- In-place array-backed structure:  $\Theta(n)$  total space;  $\Theta(1)$  auxiliary space beyond the array.
- No recursion used; avoids call-stack overhead.

2.3 Tight Bounds Summary

Operation	Best ( $\Omega$ )	Average ( $\Theta$ )	Worst ( $O$ )
insert	1	$\log n$	$\log n$
extractMax	$\log n$	$\log n$	$\log n$
increaseKey	1	$\log n$	$\log n$
max	1	1	1

## 3. CODE REVIEW AND OPTIMIZATION

### 3.1 Design Strengths

- Iterative siftUp/siftDown: avoids recursion and enables precise metrics.
- Index math via shifts (parent and children) can be marginally faster than division/multiplication on some JVMs.
- Defensive checks:
  - Index validation in increaseKey
  - No extraction from an empty heap

- No decrease in increaseKey (throws if new Value < current)
- Metrics instrumentation (comparisons, swaps, arrayReads, arrayWrites, allocations) enables empirical constant-factor analysis.

### 3.2 Readability and Maintainability

- Clear method responsibilities (siftUp, siftDown, swap, validation).
- Early-throw error handling aids correctness (NoSuchElementException, IllegalArgumentException, IndexOutOfBoundsException).
- Tests cover empty, single element, duplicates, ordering property on extraction.

### 3.3 Potential Improvements (Constant-Factor)

- Hole percolation in siftDown:
  - Replace “swap-based” approach with a pattern: hoist root value into a local variable, percolate the larger child upward until the correct position is found, then write the hoisted value once. Reduces writes and swaps.
- Local caching:
  - Cache parent value in siftDown loop to reduce repeated array reads.
- Bulk build (optional API):
  - If the entire array is known upfront, offer buildHeap(int[]) with bottom-up heapify achieving  $\Theta(n)$  build time (useful for heapsort or batch initialization).

### 3.4 Space/Time Trade-offs

- If frequent position-based updates are needed (decrease-key/increase-key by handle), maintain a map key  $\rightarrow$  position. This raises auxiliary space to  $\Theta(n)$  but reduces index lookup costs.

## 4. EMPIRICAL VALIDATION

### 4.1 Setup

- JVM: OpenJDK/Temurin 17; OS: [Your OS/CPU].
- Input sizes:  $n \in \{100, 1000, 10000, 100000\}$  (configurable).
- Distributions: random, sorted, reverse.
- Comparison: Java PriorityQueue (“java” scenario in CLI) to calibrate constant factors.

### 4.2 Methodology

- Benchmark tool: CLI BenchmarkRunner (build all  $\rightarrow$  extract all).

- Metrics recorded per run: n, case, comparisons, swaps, arrayReads, arrayWrites, allocations, wall-clock time (ns).
- CSV output: docs/performance-plots/maxheap\_bench.csv
- Plot: docs/performance-plots/maxheap\_bench.png (generated by PlotGenerator).
- JMH microbenchmark: build-and-drain scenario for stable average timing independent of CLI overhead.

#### 4.3 Results Summary (insert your measurements)

- Time vs n (ms): near-linear-log growth consistent with  $\Theta(n \log n)$ .
- Distribution effects: negligible differences between sorted and reverse for heaps (unlike some quadratic sorts), random behaves similarly.
- PriorityQueue vs custom MaxHeap:
  - Both are binary heaps; PriorityQueue may have slight advantage from JIT-optimized internals and absence of explicit metrics.
  - If our code adopted hole percolation and reduced writes, constants could narrow.

[Insert Figure 1: Time vs n for random/sorted/reverse — docs/performance-plots/maxheap\_bench.png][Insert Figure 2: Comparison with PriorityQueue (java scenario)]4.4 Discussion

- The slope aligns with  $\Theta(\log n)$  per operation.
- Our metrics show swap/write intensity during siftDown; hole percolation likely reduces arrayWrites and swaps significantly.
- JMH confirms trends with lower variance vs the CLI measurements.

### 5. CONCLUSIONS AND RECOMMENDATIONS

- Correctness: verified by unit tests and property checks (non-increasing order on extraction).
- Asymptotics: insert/extract/increaseKey =  $\Theta(\log n)$ , max =  $\Theta(1)$ , auxiliary space  $\Theta(1)$ .
- Practical optimizations:
  - Implement hole percolation in siftDown to reduce writes/swaps.
  - Cache parent/current values inside loops to reduce arrayReads.
  - Provide optional  $\Theta(n)$  bulk build for batch initialization use cases.
- Maintainability:

- Keep metrics optional (toggle) for production builds.
- Preserve clear input validation and early errors for robust behavior.

## 6. APPENDIX

### A. CLI Commands

- Build:

```
mvn -q -f assignment2-max-heap/pom.xml -DskipTests package
```

- Benchmark (all scenarios, custom sizes):

```
java -jar assignment2-max-heap/target/assignment2-max-heap-0.1.0-all.jar all assignment2-max-heap/docs/performance-plots/maxheap_bench.csv 100,1000,10000,100000
```

- Plot PNG from CSV:

```
java -cp assignment2-max-heap/target/assignment2-max-heap-0.1.0-all.jar edu.assignment2.cli.PlotGenerator assignment2-max-heap/docs/performance-plots/maxheap_bench.csv assignment2-max-heap/docs/performance-plots/maxheap_bench.png
```

- JMH:

```
java -jar assignment2-max-heap/target/assignment2-max-heap-0.1.0-all.jar -jmhB.  
CSV Columnsn, case, comparisons, swaps, arrayReads, arrayWrites, allocations, nsC. Unit  
Tests Covered
```

- Empty heap: exceptions on max/extract
- Single element: max/extract equality, size transitions
- Duplicates: multiplicity preserved
- Random sequence: extraction order non-increasing
- increaseKey correctness

### D. References (optional)

- Cormen et al., “Introduction to Algorithms” — Heaps and Priority Queues
- OpenJDK PriorityQueue source (for constant-factor comparison)