



CS61B Review Session

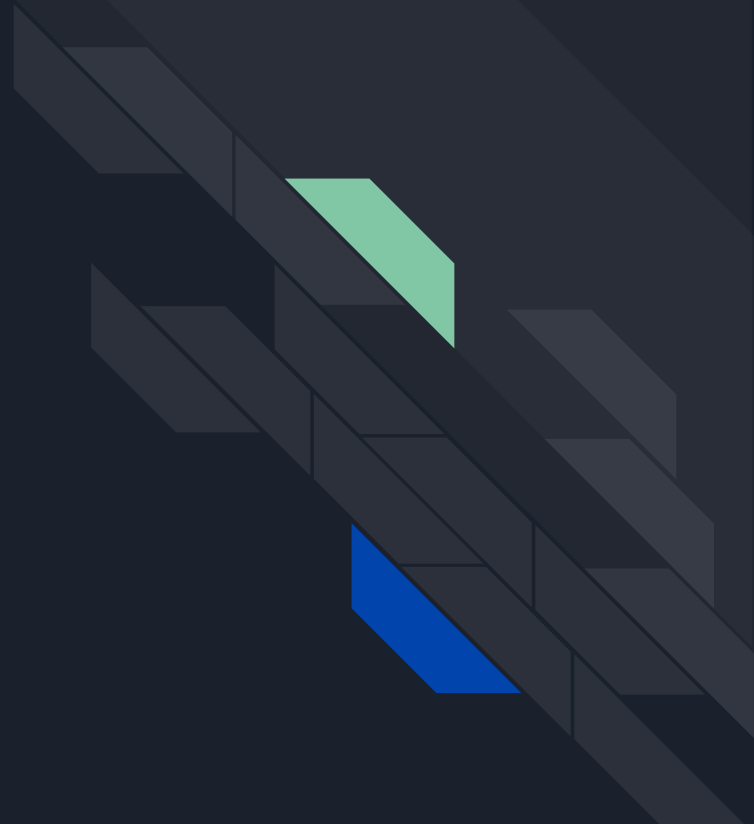
Hongli (Bob) Zhao



Agenda

- Asymptotic analysis
 - Big O notation
 - Tips for Runtime Analysis
 - Example
- Sorting algorithms
 - Comparison sorting vs. count sorting
 - Runtime analysis
 - Stability
 - Tips for Exams

Asymptotics

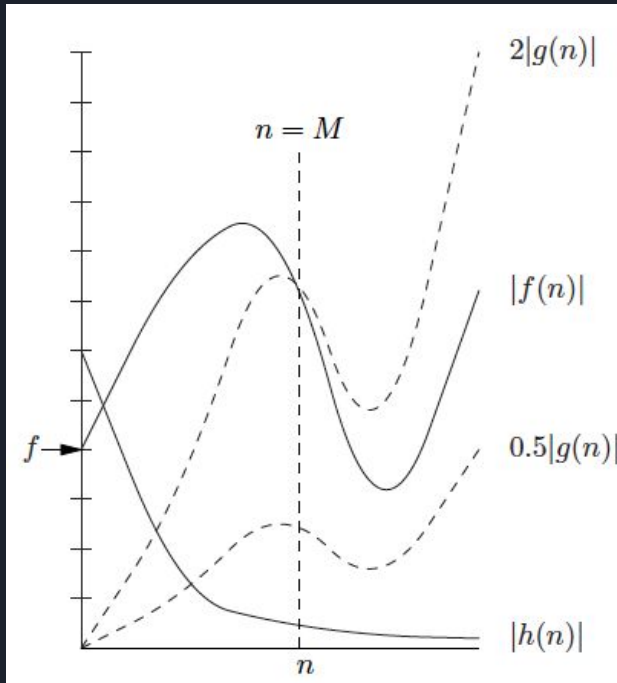




Importance of Analyzing Time and Space Complexity

- Complexity is a measure of how “good” our program is
- Allows us to quantitatively and qualitatively scale up our programs
- Makes our development process maintainable by observing properties of input data

Big-O, Big-Omega and Theta



- We are interested in how the algorithm behaves in the long run
- Specify asymptotic bounds on families of functions:
 - $O(f(x))$ - the bounded above family
 - $\Omega(f(x))$ - the bounded below family
 - $\Theta(f(x))$ - tight bound
 - **Note:** “bounded above/below” does not specify absolute performance
 - Common “shapes”: $O(1)$, $O(N)$, $O(N^p)$, $O(\log N)$, $O(N \log N)$, $O(a^N)$, $O(N^N)$

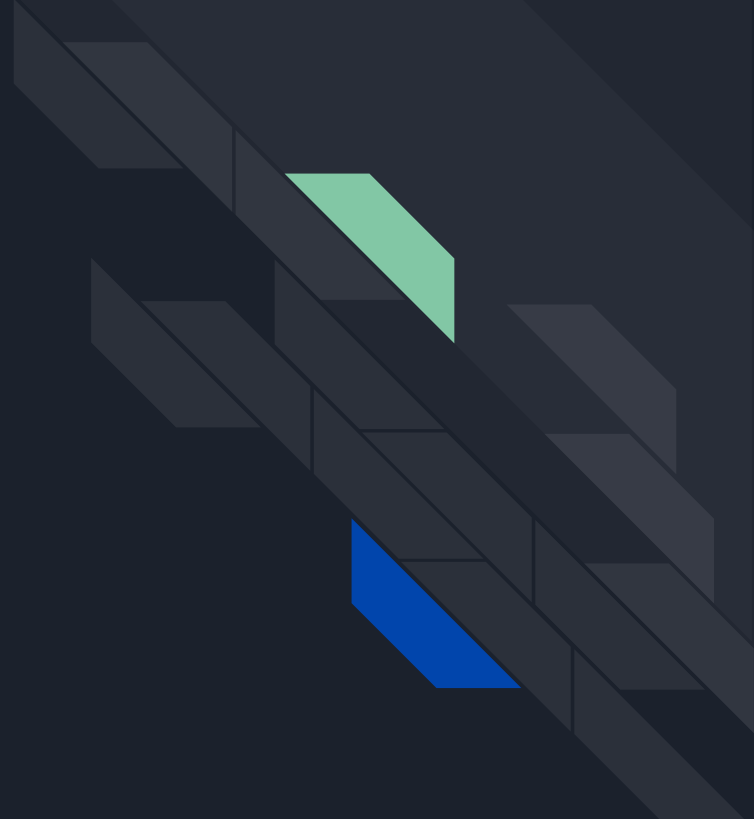


General Rules of Thumb

- Do not make assumptions about the size of an input
 - Demo
- Only consider asymptotic behavior
 - Ignore lower order terms and constants
 - Ex. What is the relationship between $O(\log N^2)$ and $O(\log N^3)$?
- Test out different properties of data
 - Different inputs may yield different best case and worst case runtime
 - When upper bound and lower bound differ, there is no tight bound

Sorting Algorithms

- Main ideas
- Stability
- Practice test problems





Terminology

- Stability:

A sorting algorithm is stable if it preserves the original ordering of already sorted items

Ex. {2, 3, 1, 4a, 9, 4c, 7, 4b}

{1, 2, 3, 4a, 4c, 4b, 7, 9}

{1, 2, 3, 4a, 4b, 4c, 7, 9}

- Inversions:

Measures how disordered a sequence of items is

- Number of inversions:

- The minimum number of pair swaps required to sort the list
- Ex. {1, 3, 4, 2} has 2 inversions



Comparison sorts

- Does not rely on structure of data; only assumes an order exists
 - Arranges elements in order such that $arr[i] \leq arr[i+1]$ is true
- Cannot perform better than $\Omega(N \log N)$
 - Proof by *Stirling's approximation*
- Important sorts: Insertion sort, Selection sort, Quick sort, Heap sort, Merge sort



Counting sorts

- What if we can do more than comparing?
 - range of data is limited (ex. Alphabet, bits, range of integers)
- Groups objects according to a certain criteria, and use the array structure to indicate ordering
- Can outperform $\Omega(N \log N)$
 - Has linear dependence on size of “dictionary”
- Important sorts: LSD sort, MSD sort



Insertion Sort

- In each loop, start from the leftmost unsorted entry, compare with the entry immediately to its left; Swap the two entries if $arr[i+1] < arr[i]$
- Repeat the first step until the entry to the left is not larger than this entry, or this entry has reached the left end of the array
- Repeat the previous two steps until all entries are sorted
- **Runtime:** $\Omega(N)$, $O(N^2)$
 - Best case achieved when list is nearly sorted
 - Worst case when list is in reverse order

{ 53, 26, 94, 18, 70 }

{ 26, 53, 94, 18, 70 }

{ 26, 53, 94, 18, 70 }

{ 26, 53, 18, 94, 70 }

{ 26, 18, 53, 94, 70 }

{ 18, 26, 53, 94, 70 }

{ 18, 26, 53, 70, 94 }

{ 18, 26, 53, 70, 94 }



Selection Sort

- Starting from the unsorted array, find the minimum value, and swap with the first value
- Starting from the unsorted (N-1) values, find the minimum value, and swap with the second value
- Repeat the process until all values are sorted
- **Runtime:** $O(N^2)$ in all cases:
 - $O(N)$ for finding minimum value
 - $O(N)$ for running selection sort on each entry

{ 53, 26, 94, 18, 70 }

{ 18, 26, 94, 53, 70 }

{ 18, 26, 94, 53, 70 }

{ 18, 26, 53, 94, 70 }

{ 18, 26, 53, 70, 94 }

{ 18, 26, 53, 70, 94 }

Heap Sort

Better than selection sort

- Assuming we are using a max-heap, starting from the unsorted array, heapify the array
- Swap smallest value with the root of the heap, pop the largest value and put at the back of the array
- Re-heapify the (N-1) unsorted array
- Repeat the previous steps until all values have been popped
- **Runtime:** $O(N \log N)$:
 - Heapifying: $O(N \log N)$
 - Swap: $O(1) * N = O(N)$
 - Reheapify: $O(\log N) * N = O(N \log N)$

{ 53, 26, 94, 18, 70 }

{ 94, 70, 53, 26, 18 }

{ 18, 70, 53, 26, 94 }

{ 18, 70, 53, 26 } {94}

{ 70, 26, 53, 18 } {94}

{ 18, 26, 53, 70 } {94}

{ 18, 26, 53 } {70, 94}

{ 53, 26, 18 } {70, 94}

{ 18, 26, 53 } {70, 94}

{18, 26} { 53, 70, 94 }



Quick Sort

- Select a pivot to partition the array (usually the middle element)
- Smaller value goes left, large value goes right
- Repeat the first two steps until all sub-arrays cannot be partitioned anymore or have met a certain limit
- **Runtime:** $\Omega(N \log N)$, $O(N^2)$
 - Depends on specific choice of pivot!

{ 53, 26, 94, 18, 70 }

{ 53, 26 } 94 { 18, 70 }

{ 53, 26, **18**, **70** } 94

{ 53, 26 } 18 { 70 } 94

18 { **53**, **26**, 70 } 94

18 { 53 } 26 { 70 } 94

18 26 { **53**, **70** } 94

{ 18, 26, 53, 70, 94 }



Merge Sort

- Split: Recursively splits array into halves until further partitioning is impossible (singleton lists)
- Merge: From the bottom level, recursively build up the original sorted list
- **Runtime:** always $O(N \log N)$!
 - $O(N)$: merging back every level
 - $O(\log N)$: number of levels

{ 53, 26, 94, 18, 70 }

{53, 26, 94} {18, 70}

{53, 26} {94} {18} {70}

{53} {26} {94} {18} {70}

{26, 53} {94} {18, 70}

{ 26, 53, 94 } {18, 70 }

{ 18, 26, 53, 70, 94 }



LSD / MSD Radix Sort

- Starting from the most significant / least significant digit, perform counting sort on the digit
- Repeat counting sort on the rest of the digits
 - LSD: from right to left
 - MSD: from left to right
- **Runtime:** $O(B)$
 - Each placement takes $O(1) * B$ byte size of each entry

{1219, 2523, 1311, 4215, 3132}

{1311, 3132, 2523, 4215, 1219}

{1311, 4215, 1219, 2523, 3132}

{3132, 4215, 1219, 1311, 2523}

{1219, 1311, 2523, 3132, 4215}



Tips for Exam Problems

- **Pattern matching**
 - Heap sort has the greatest “shuffling” when starting out
 - Merge sort does not start sorting until all splitting has finished
 - Look for growing sorted sequence in selection and heap sort
 - insertion sort moves sequentially to the right
- **Algorithm implementations / Choosing algorithms**
 - Example facts:
 - When would we prefer insertion sort over merge sort?
 - How to implement Heap Sort using a min-heap?
- **Details about algorithms:**
 - How many inversions are there in {10,9,7,1,6}?
 - Will {1123, 1830, 1960, 1110, 1210, 1390} ever appear in the process of a LSD radix sort?

Summary

Algorithm	Best case	Worst case	Stability	Note	
Insertion	N	N^2	Yes	Performance depends on number of inversions	
Selection	N^2	N^2	depends	Has constant space. Can be made stable if use linked lists	
Heap	N	$N \log N$	No	Has the greatest “shuffling”	
Quick	$N \log N$	N^2	No	Runtime depends on choice of pivoting	
Merge	$N \log N$	$N \log N$	Yes	Can be highly parallellized	
LSD/MSD Radix	B	B	Yes	$B = N * K$ (size of array * length of each item)	

Thank you!

