1. Asymptotic analysis

Consider the following equations:

- $f(n) = 600n + n \log_5(n)$
- $g(n) = 30n^2$
- $h(n) = 5n \log_3(n)$
- $i(n) = 4 \log_4(n)$

Use these equations and show the following. Note: you may need to use the change-of-base identity for some of these problems. (See the list of identities located at the end of this handout).

- (a) Show that $f(n) \in \mathcal{O}(g(n))$.
- (b) Show that $h(n) \in \Omega(i(n))$.
- (c) Show that $h(n) + i(n) \in \Omega(f(n) + i(n))$.
- (d) Show that $f(n) \in \Theta(h(n))$.

2. Finding closed forms

For each of the following, find a closed form using the tree method and a big-Theta bound using the master method. If you cannot use the master method on a particular recurrence, briefly explain why.

See the last page of this handout for a list of identities.

(a)
$$A(x) = \begin{cases} 1 & \text{if } x = 1\\ 3A(\frac{x}{3}) + 3x^2 & \text{otherwise} \end{cases}$$

(b)
$$B(n) = \begin{cases} 1 & \text{if } n = 1\\ 8B(\frac{n}{3}) + 2n & \text{otherwise} \end{cases}$$

(c)
$$C(x) = \begin{cases} 3 & \text{if } x = 1 \\ 4C(\frac{x}{5}) + x^3 + 2 & \text{otherwise} \end{cases}$$

(d) $D(n) = \begin{cases} 3 & \text{if } n = 1\\ 3D(n-1) + 2 & \text{otherwise} \end{cases}$

3. Memory, locality, and dictionaries

(a) In lecture, we discussed three different optimizations for disjoint sets: union-by-rank, path compression, and the array representation.

If we implement disjoint sets using Node objects with a "data" and "parent" field and implement the first two optimizations, our find and union methods will have a nearly-constant average-case runtime.

In that case, why do we bother with the array representation?

(b) Recall that during your midterm, you were asked to consider the time needed to iterate over the key-value pairs of a SortedArrayDictionary vs an AvlDictionary. It turned out that it iterating over the SortedDictionary is nearly 10 times faster then iterating over the AvlDictionary. You were then asked to discuss why that might be.

Now, suppose we take those same dictionaries and try repeatedly calling the get(...) method a few hundred thousand times, picking a different random key each time.

Surprisingly, we no longer see such an extreme difference in performance. The SortedArrayDictionary is at most only about twice as fast as the AvlDictionary.

Why do you suppose that is? Be sure to discuss both (a) why the difference in performance is much less extreme and (b) why SortedArrayDictionary is still a little faster.

(c) Suppose that we are trying to store an absurd amount of data inside of a dictionary: too large to fit in memory. We discussed in lecture how we might modify tree-based dictionaries to store a large amount of data (B-trees).

How would you modify hash tables to successfully store large amounts of data?

4. Heaps

Consider the following list of numbers:

[1, 5, 2, -6, 7, 12, 3, -5, 6, 2, 1, 6, 7, 2, 1, -2]

- (a) Insert these numbers into a min 2-heap (into a min-heap with up to two children per node). Show both the final tree and the array representation.
- (b) Insert these numbers into a max 3-heap (nto a max-heap with up to three children per node). Show both the final tree and the array representation.
- (c) Insert these numbers into a min 4-heap using Floyd's buildHeap algorithm. Show both the final tree and the array representation.
- (d) Insert these numbers into a max 2-heap using Floyd's buildHeap algorithm. Show both the final tree and the array representation.
- (e) Suppose we modify Floyd's buildHeap algorithm so we start from the front of the array, iterate forward, and call percolateDown(...) on each element. Why is this a bad idea?

5. Sorting

(a) During lecture, we focused on four different sorting algorithms: insertion sort, merge sort, quick sort, and counting sort.

For each of these four algorithms, state:

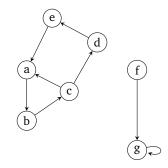
- The best and worst-case runtimes
- Whether the sorting algorithm is stable
- Whether the sorting algorithm is in-place
- Whether the sorting algorithm is a general-purpose one, or if there are any restrictions on how it can be used.
- (b) Suppose we want to sort an array containing 50 strings. Which of the above four algorithms is the best choice?
- (c) Suppose we have an array containing a few hundred elements that is almost entirely sorted, apart from a one or two elements that were swapped with the previous item in the list. Which of the algorithms is the best way of sorting this data?
- (d) Suppose we are writing a website named "sort-my-numbers.com" which accepts and sorts numbers uploaded by the user. Keeping in mind that users can be malicious, which of the above algorithms is the best choice?
- (e) Suppose we want to sort an array of ints, where we know all the ints are between 0 and 1000. Which of the above algorithms is the best choice?
- (f) Suppose we want to sort an array of ints, but also want to minimize the amount of extra memory we want to use as much as possible. Which of the above algorithms is the best choice?
- (g) Suppose we want to sort an array of chars. Assuming the chars are all lowercase alphabetical letters, which of the above algorithms is the best choice?
- (h) On the homework, you were asked to find a way of building an array that would cause a version of quick sort implemented using the median-of-three pivoting strategy to run in $O(n^2)$ time.

Now, find a way of making a version of quick sort implemented using the random pivot selection strategy run in $O(n^2)$ time.

(i) How can you modify both versions of quicksort so that they no longer display $O(n^2)$ behavior given the same inputs?

6. Graph basics

Consider the following graph:

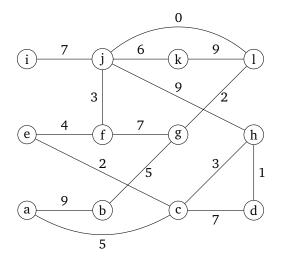


- (a) Draw this graph as an adjacency matrix.
- (b) Draw this graph as an adjacency list.
- (c) Suppose we run BFS on this list, starting on node *a*. In what order do we visit each node? Assume we break ties by selecting the node that's alphabetically lower.
- (d) Suppose we run DFS on this list, starting on node *a*. In order do we visit each node? Assume we break ties in the same way as above.

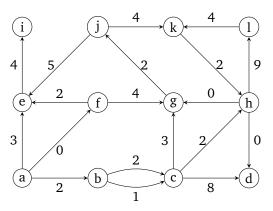
7. Dijkstra's algorithm

For each of the graphs below, list the final costs of each node, the edges selected by Dijkstra's algorithm, and whether or not Dijkstra's algorithm returned the correct result. In the case of ties, select the node that is the smallest alphabetically.

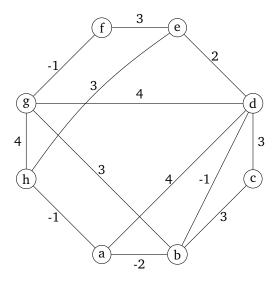
(a) Run Dijkstra's algorithm starting on node *a*.



(b) Run Dijkstra's algorithm starting on node *a*.



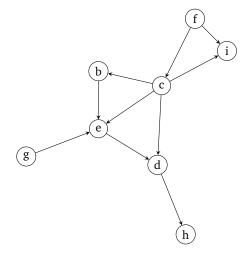
(c) Run Dijkstra's algorithm starting on node *a*.



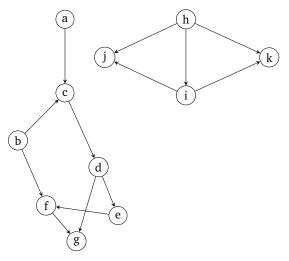
(d) Now, run Dijkstra's algorithm on the same graph above, but starting on node e.

8. Topological sort

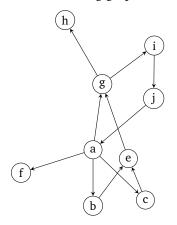
(a) List three different topological orderings of the following graph. If no ordering exists, briefly explain why.



(b) List three different topological orderings of the following graph. If no ordering exists, briefly explain why.

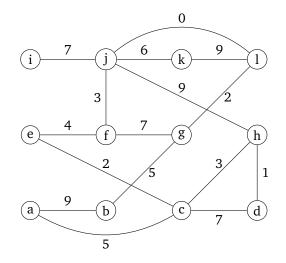


(c) List three different topological orderings of the following graph. If no ordering exists, briefly explain why.



9. Minimum spanning trees

Consider the following graph:



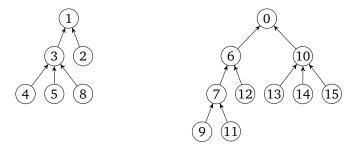
(a) Run Prim's algorithm on the above graph starting on node a to find a minimum spanning tree.

Draw the final MST and the costs per each node. In the case of ties, select the node that is the smallest alphabetically.

(b) Run Kruskal's algorithm on the above graph to find an MST. In the case of ties, select the edge containing the node that is the smallest alphabetically.

Draw the final MST.

(c) Suppose we have the following disjoint set. What happens when we run union(7, 8)? Draw both the new trees as well as the array representation of the disjoint set.



(d) Suppose we have a disjoint set containing 16 elements. Assuming our disjoint set implements the union-byrank and path-compression algorithm, what is the height of the largest possible internal tree we can construct? Draw what this tree looks like, and what sequence of calls to union(...) and findSet(...) creates this tree.

10. Debugging

Suppose we are in the process of implementing a hash map that uses open addressing and quadratic probing and want to implement the delete method.

- (a) List four different test cases you would write to test this method. For each test case, be sure to either describe or draw out what the table's internal fields look like, as well as the expected outcome (assuming the delete method was implemented correctly).
- (b) Consider the following implementation of delete. List every bug you can find.

Note: You can assume that the given code compiles. Focus on finding run-time bugs, not compile-time bugs.

```
public class QuadraticProbingHashTable<K, V> {
    private Pair<K, V>[] array;
    private int size;
    private static class Pair<K, V> {
        public K key;
        public V value;
    }
    // ...snip...
    /**
     * Deletes the key-value pair associated with the key, and
     * returns the old value.
     *
     * @throws NoSuchKeyException if the key-value pair does not exist in the method.
     */
    public V delete(K key) {
        int index = key.hashCode() % this.array.length;
        int i = 0;
        while (this.array[index] != null && !this.array[index].key.equals(key)) {
            i += 1;
            index = (index + i * i) % this.array.length;
        }
        if (this.array[index] == null) {
            throw new NoSuchKeyException("Key-value pair not in dictionary");
        }
        this.array[index] = null;
        return this.array[index].value;
    }
}
```

11. Graphs and design

Consider the following problems, which we can all model and solve as a graph problem.

For each problem, describe (a) what your vertices and edges are and (b) pseudocode or an English description of how you would solve the given problem.

Your description does not need to explain how to implement any of the algorithms we discussed in lecture. However, if you *modify* any of the algorithms we discussed, you must discuss what that modification is.

- (a) A popular claim is that if you go to any Wikipedia page and keep clicking on the first link, you will eventually end up at the page about "Philosophy". Suppose you are a given some Wikipedia page as a random starting point. How would you write an algorithm to verify this claim?
- (b) Suppose you are given a list of statements about how cities are located relative to each other as input. For example, suppose we had the following statements as input:
 - Seattle is north of Portland
 - Seattle is west of Spokane
 - Portland is south-east of Spokane
 - Spokane is west of New York
 - Seattle is south of Vancouver

These statements are all internally consistent with each other. Now, suppose we add one more statement to the list:

• Portland is north of Vancouver

If we add this statement to our list, we suddenly have an inconsistency! We previously said Seattle was north of Portland, and that Vancouver was north of Seattle. In that case, it's impossible for Portland to also be north of Vancouver.

How would you write an algorithm to determine whether a given list of statements is consistent or not?

(c) Suppose you have a bunch of computers networked together connected together (haphazardly) using wires. You want to send a message to every other computer as fast as possible. Unfortunately, some wires are being monitored by some shadowy organization that wants to intercept your messages.

After doing some reconnaissance, you were able to assign each wire a "risk factor" indicating the likelihood that wire is being monitored. For example, if a wire has a risk factor of zero, it is extremely unlikely to be monitored; if a wire has a risk factor of 10, it is more likely to be monitored. The smallest possible risk factor is 0; there is no largest possible risk factor.

Implement an algorithm that selects wires to send your message long such that (a) every computer receives the message and (b) you minimize the total risk factor. The total risk factor is define as the sum of the risks of all of the wires you use.

- (d) Explain how you would implement an algorithm that uses your predictions to find any computers where sending a message would force you to transmit a message over a wire with a risk factor of k or higher.
- (e) Suppose you have a graph containing |V| nodes. What is the maximum number of edges you can add while ensuring the graph is always a DAG? Assume you are not permitted to add parallel edges.

(f) Suppose you were walking in a field and unexpectedly ran into an alien. The alien, startled by your presence, dropped a book, ran into their UFO, and flew off.

This book ended up being a dictionary for the alien language – e.g. a book containing a bunch of alien words, with corresponding alien definitions.

You observe that the alien's language appears to be character based. Naturally, the first and burning question you have is what the alphabetical order of these alien characters are.

For example, in English, the character "a" comes before "b". In the alien language, does the character " \mathcal{D} " come come before or after character " ϱ "? The world must know.

Assuming the dictionary is sorted by the alien character ordering, design an algorithm that prints out all plausible alphabetical orderings of the alien characters.

12. P and NP

Consider the following decision problem:

ODD-CYCLE: Given some input graph G, does it contain a cycle of odd length?

You want to show this decision problem is in NP.

- (a) What is a convincing certificate a solver could return for this problem?
- (b) Describe, in pseudocode, how you would implement the verifier.
- (c) What is the worst-case runtime of your verifier?
- (d) Do you think it's likely this algorithm also happens to be in P? Why or why not?

13. Short answer

For each of the following questions, answer "true", "false", or "unknown" and justify your response. Your justification should be short – at most 2 or 3 sentences.

- (a) If we implement Kruskal's algorithm using a general-purpose sort, Kruskal's algorithm will run in nearlyconstant time.
- (b) If we have an efficient way of solving some arbitrary NP problem, we have an efficient way of solving ALL NP problems.
- (c) It is possible to reduce all problems in P to some problem in NP.
- (d) Dijkstra's algorithm will always return the incorrect result if the graph contains negative-length edges.
- (e) Suppose we want to find a MST of some arbitrary graph. If we run Prim's algorithm on any arbitrary node, we will always get back the same result.
- (f) $\mathcal{O}(n^2 \log(3) + 4) = \mathcal{O}(4n + n^2)$
- (g) There is an efficient way of solving the 3-COLOR decision problem.

- (h) Iterating over a list using the iterator is always faster then iterating by repeatedly calling the get(...) method.
- (i) We can always sort some list of length n in $\Theta(n)$ time.
- (j) In a simple graph, if there are |E| edges, the maximum number of possible vertices is $|V| \in \mathcal{O}(|E|^2)$.
- (k) 2-COLOR is in NP.
- (l) The .get(...) method of hash tables has a worst-case runtime of $\mathcal{O}(n)$, where n is the number of key-value pairs.
- (m) A hash table implemented using open addressing is likely to have suboptimal performance when $\lambda > 0.5$.
- (n) The peekMin(...) method in heaps has a worst-case runtime of $O(\log(n))$.
- (o) If a problem is in NP, that means it must take exponential time to solve.
- (p) For any given graph, there exists exactly one unique MST.

Identities

Splitting a sum

$$\sum_{i=a}^b (x+y) = \sum_{i=a}^b x + \sum_{i=a}^b y$$

Factoring out a constant

$$\sum_{i=a}^{b} cf(i) = c \sum_{i=a}^{b} f(i)$$

Change-of-base identity

 $\log_a(n) = \frac{\log_b(n)}{\log_a(b)}$

Gauss's identity

$$\sum_{i=0}^{n-1} i = 0 + 1 + \ldots + n - 1 = \frac{n(n-1)}{2}$$

Finite geometric series

$$\sum_{i=0}^{n-1} r^i = \frac{r^n - 1}{r - 1}$$

Master theorem

Given a recurrence of the form:

$$T(n) = \begin{cases} d & \text{if } n = 1\\ aT\left(\frac{n}{b}\right) + n^c & \text{otherwise} \end{cases}$$

We know that:

- If $\log_b(a) < c$ then $T(n) \in \Theta(n^c)$
- If $\log_b(a) = c$ then $T(n) \in \Theta(n^c \log(n))$
- If $\log_b(a) > c$ then $T(n) \in \Theta\left(n^{\log_b(a)}\right)$