## Instructions

These are problems you should only discuss with your homework group and instructional staff. Do exactly one of the review problems, and all the remaining problems.

KEY CONCEPTS Inclusion/Exclusion, Ranking/Unranking, Huffman Encoding, Graph representations.

Review question for homework 1 -20 points A group of n people are playing frisbee, throwing the disk from one person to another. Amazingly, no one ever drops the frisbee or misses the throw. Let  $Catch_i$  be the number of times person i has caught the frisbee,  $Throw_i$  the number of times person i has thrown the frisbee. Prove that at the end of the game,  $\sum_i Catch_i = \sum_i Throw_i$ .

We can prove this by induction on the number of throws. If there have been 0 throws, all  $Catch_i = 0$  and all  $Throw_i = 0$ , so  $0 = \sum_i Catch_i = \sum_i Throw_i$ .

Assume after t throws,  $\sum_i Catch_i = \sum_i Throw_i$ . Then the next throw is between from some person  $i_1$  to some person  $i_2$ . If we let  $Catch_i'$  be the number of catches after this throw,  $Catch_i' = Catch_i$  for  $i \neq i_2$ , and  $Catch_{i_2}' = Catch_{i_2} + 1$ . Similarly, if we let  $Throw_i'$  be the number of throws after this throw,  $Throw_i' = Throw_i$  for  $i \neq i_1$ , and  $Throw_{i_1}' = Throw_{i_1} + 1$ . So  $\sum_i Catch_i' = Catch_{i_2} + \sum_{i \neq i_2} Catch_i' = Catch_{i_2} + 1 + \sum_{i \neq i_2} Catch_i = 1 + \sum_i Catch_i = 1 + \sum_i Throw_i = 1 + Throw_{i_1} + \sum_{i \neq i_1} Throw_i' = \sum_i Throw_i'$ . So the claim is still true after t+1 throws

So by induction on the number of throws, the claim is true after any number of throws.

**Review question for homework 2- 20 points** Say we are given two sorted lists A[1..k] and B[1..n] where k < n/2. Give an algorithm that decides whether the lists intersect, i.e., is some A[i] = B[j]? Your algorithm should work in time  $O(k \log n/k)$ . Hint: use a method similar to window encoding, breaking B up into blocks of size n/k and using binary search for each block.

Our algorithm is below. It uses a Binary search procedure that given a sorted list B[1..m] and a value V returns True if V is in the list and False otherwise. : IntersectSorted(A[1..k], B[1..n]): sorted lists of integers.

- 1. If k ==1 return BinarySearch(B[1..n], A[1]).
- 2. Else let  $w = \lceil n/k \rceil$

- 3. J = 1.
- 4. FOR I = 1 to k do:
- 5. While A[I] > B[Jw] and  $Jw \le n$  do: J + +.
- 6. IF BinarySearch(B[(J-1)w+1,..min(n,Jw)],A[I]) then return True.
- 7. Return False.

First, for the running time, we do at most one binary search in a range of at most w for each I. In addition, since we only increment J and if it exceeds k, Jw > n and the while loop condition is false, we increment J at most k times, and check the condition for the while loop at most once per I when it is false. Thus, the total time is  $O(k+k+k\log w) = O(k\log n/k)$ , since the condition n > k/2 implies the last term is the largest.

The algorithm maintains the invariant that if J > 1, then B[(J-1)w] < A[I]. We only increment J if A[I] > B[Jw], so after we increment J it is true. The other place where we change I and J is when we increment I in the FOR loop, but since A is non-decreasing, if we increment I, A[I] only increases.

For each I then, after the While loop terminates, we either have Jw > n and B[(J-1)w] < A[I] or B[(J-1)w] < A[I] < B[Jw]. In either case, A[I] cannot match any value outside the sub-array B[(J-1)w+1...min(n,Jw)]. So by the correctness of binary search, we return True at this point if and only if A[I] is in the array B[1...n]. Since we do this for all I, overall we return True if and only if the arrays intersect.

Review question for homework 3- 20 points Remember that the Fibonacci sequence is given by F(0) = F(1) = 1, F(n) = F(n-1) + F(n-2) for  $n \ge 2$ . On the review question 1 in the previous assignment, the following identity was proved,  $\forall 0 < k < n$ , Fib(n) = Fib(k)Fib(n-k) + Fib(k-1)Fib(n-k-1). Use this identity to give a divide-and-conquer recursive algorithm that, given n, returns Fib(n) and Fib(n+1). Prove correctness using the identity, and give a time analysis assuming arithmetic operations are constant time.

If  $n \leq 3$  we can just use a table look-up.

Assume n > 3 is even and we use the identity with k = n/2 for both n and n + 1. Then  $Fib(n) = Fib(n/2)^2 + Fib(n/2 - 1)^2$  and Fib(n + 1) = Fib(n/2)Fib(n/2 + 1) + Fib(n/2 - 1)Fib(n/2). Calling our algorithm recursively on n/2 - 1 gives us Fib(n/2 - 1) and Fib(n/2). We can then add the two together to get Fib(n/2 + 1) and use these in the above formulas to compute Fib(n) and Fib(n + 1) with a constant number of additional arithmetic operations. If n > 3 is odd, we can apply the above to n - 1, and then add Fib(n - 1) and Fib(n) to get Fib(n + 1).

In all cases, we compute one sub-problem at most n/2 and then do a constant number of arithmetic operations. So assuming arithmetic is constant

time, the recurrence is T(n) = T(n/2) + O(1). Applying the Master Theorem with a = 1, b = 2 and d = 0, since  $a = b^d$ , we are in the steady-state case, and  $T(n) \in O(\log n)$ .

Review question for homework 4- 20 points Remember that the Fibonacci sequence is given by F(0) = F(1) = 1, F(n) = F(n-1) + F(n-2) for  $n \geq 2$ . Consider the set of sequences of 0's and 1's of length n that do not have two consecutive 1's. Prove that the number of such sequences is Fib(n+1).

When n = 0 there is one sequence (the empty sequence) and it contains no two consecutive 1's, so the number is 1 = Fib(0+1). When n = 1 there are two sequences (0,1) and neither contain two consecutive 1s, so the number is 2 = Fib(1+1).

Assume for  $N \geq 1$  and all  $0 \leq n \leq N$  that the number of such strings of length n is Fib(n+1). Then we can break the strings of length N+1 with no consecutive 1's into two groups: those with first bit 0 and those with first bit 1. The remaining N bits in the first group can be any string of length N with no consecutive 1's, so by the induction hypothesis, there are Fib(N+1) of them. The second group must all have second bit 0, and then be any string of length N-1 with no two consecutive 1's, so again by hte induction hypothesis, there are Fib(N) of these. So the total number is Fib(N+1)+Fib(N)=Fib(N+2), as desired. Thus, by strong induction on n, there are always Fib(n+1) such strings of length n.

**Inclusion-exclusion** (Short answer, with brief explanation, 10 points) How many alphanumeric passwords of length 9 have at least one upper case letter, at least one lower case letter, and at least one numeral?

Let A be the set of strings with no upper case letters, B be the set of strings with no lower case letters, and C the set of strings with no numerals. The strings we are counting are all those that are not in  $A \cup B \cup C$ . Using inclusion-exclusion,  $|A \cup B \cup C| = |A| + |B| + |C| - |A \cap B| - |A \cap C| - |B \cap C| + |A \cap B \cap C|$ . There are 26 + 10 possible characters for each position of a string in A or B, and 52 for a string in C, so  $|A| = (36)^9 = |B|$  and  $|C| = (52)^9$ . Strings in  $A \cap B$  have no lower case or upper case letters, so only numerals, so there are  $10^9$  of these. Similarly,  $A \cap C$  strings have only lower case letters, and  $B \cap C$  only upper case, so both sets have size  $(26)^9$ . There are no strings with no upper case letters, lower case letters, or numerals, so the intersection of all three sets is empty. Thus,  $|A \cup B \cup C| = 2 * (36)^9 + (52)^9 - 2(26)^9 - (10)^9$ . Finally, these are the ones we aren't counting out of  $(62)^9$  total, so the number we are counting is Thus,  $(62)^9 - 2 * (36)^9 - (52)^9 + 2(26)^9 + (10)^9$ .

Coding bounded sequences A bounded sequence of length n is a sequence of integers so that the next element is either one greater than or less than the previous element.

Here are a few examples of bounded sequences of length 8, starting with1:

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(1, 2, 3, 4, 3, 2, 1, 0), (1, 2, 1, 2, 1, 2, 1, 2), (1, 0, -1, -2, -3, -4, -3, -2)
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1. For  $m, n \ge 1$ , how many bounded sequences of length n are there that start with an integer between 1 and m? (give a brief justification.) (5 points)

We have m possible values for the first element, and once we fix the previous one, two possible values for each consecutive element. So the total number is  $m * 2^{n-1}$ .

- 2. How many bits would the most efficient encoding of such sequences use? (in terms of n and m. Justify your work) (5 points) We thus need  $\lceil log_2(m2^{n-1}) \rceil = \lceil \log m \rceil + n 1$  bits to code such sequences.
- 3. Develop your own encoding/decoding algorithm where the code uses this number of bits. Describe your algorithms, and show the decoding recovers the encoded message. (10 points)

Say the sequence is  $a_1, a_2, ...a_n$ . We use a fixed length code for the first element in the sequence, such as the binary representation of  $a_1 - 1$  with leading 0's to make it fixed length. Let this code be  $C(a_1)$ . Then for each  $1 < i \le n$ , we let  $b_i$  be 0 if  $a_i = a_{i-1} - 1$  and 1 if  $a_i = a_{i-1} + 1$ . So our code for the sequence is :  $C(a_1)b_2...b_n$ . and has length exactly  $\lceil \log_2 m \rceil + n - 1$ .

To decode, we let  $A_1$  be the first log(m) bits as a binary number, +1. Then for i=2 to n, if  $b_i=1$ , we let  $A_i=A_{i-1}+1$  and otherwise we let  $A_i=A_{i-1}-1$ . Since  $C(a_1)$  is the binary representation of  $a_1-1$ ,  $A_1=a_1$ . Assume  $A_{i-1}=a_{i-1}$ . If  $a_i=a_{i-1}-1$ ,  $b_i=0$ , and  $A_i=A_{i-1}-1=a_{i-1}-1=a_i$ . If  $a_i=a_{i-1}+1$ ,  $b_i=1$ , and  $A_i=A_{i-1}+1=a_{i-1}+1=a_i$ . So by induction on i, the decoded sequence  $A_i$  is equal to the original sequence  $a_i$ .

4. How many bounded sequences of length n have first and last element 0?

Consider the part  $b_2..b_n$  of the encoding above. To begin and end at 0, we must have an equal number of steps that increase by 1, and decrease by 1. So there must be (n-1)/2 0's and (n-1)/2 1's in the sequence. In particular, there are no such sequences when n is even. When n is odd, any suc bit string is the code of some sequence begining and ending at 0, so the number of such sequences is the number of strings of length n-1 with exactly (n-1)/2 1's,  $\binom{(n-1)}{(n-1)/2}$ . (10 points)

Coding using ranking In review problem 4 above, it is shown that the number of binary sequences of length n with no consecutive pair of 1's is F(n+1), the n+1'st fibonacci number. How many bits do we need to encode such a string? (5 points).

 $\lceil log_2 Fib(n+1) \rceil = \lceil log_2(\Phi^n) \rceil = \lceil n \log_2 \Phi \rceil$ , where  $\Phi$  is the golden ratio.

Give a ranking based encoding algorithm to encode such strings with this number of bits (5 points).

We know that there are Fib(n) strings in our set that start with 0 and Fib(n-1) that start with 10. We can give each string its lexicographical ranking within this set as follows:  $Rank(b_1..b_n)$ 

- 1. If n == 0 return 0.
- 2. IF n == 1 return  $b_1$ .
- 3. If  $b_1 == 0$  THEN return  $Rank(b_2..b_n)$ .
- 4. ELSE return  $Fib(n) + Rank(b_3..b_n)$ .

Then give the corresponding deconding algorithm (5 points).

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UnRank(V, n) : 0 \le V \le Fib(n+1)
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- 1. If n == 0 return the empty string.
- 2. IF n == 1 return V.
- 3. If V < Fib(n) THEN return  $0 \circ UnRank(V, n-1)$ .
- 4. ELSE return  $10 \circ UnRank(V Fib(n), n 2)$ .

Show that the decoding algorithm applied to the coding algorithm is the original string (5 points).

We prove this by strong induction on n, i.e., prove that  $Unrank(Rank(b_1..b_n), n) = b_1..b_n$  for any string with no two consecutive 1's.

If n = 0, Rank of the empty string returns 0, and UnRank with n = 0 returns the empty string, which is our input.

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If n = 1, Rank(b_1) = b_1, and Unrank(b_1, 1) = b_1.
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Assume the equation is true for some  $N \ge 1$  and all  $0 \le n \le N$  and let  $b_1...b_{N+1}$  be an input.

If  $b_1=0$ , let  $V=Rank(b_1..b_{N+1})=Rank(b_2..b_{N+1})< Fib(N+1)$ . Then  $Unrank(V,N+1)=0\circ Unrank(V,N)=0\circ Unrank(Rank(b_2..b_{N+1}),N)=0b_2..b_{N+1}=b_1..b_{N+1}$  where the second to last step is the induction hypothesis.

If  $b_1 = 1$ , let  $V = Rank(b_1..b_{N+1}) = Fib(N+1) + Rank(b_3..b_{N+1}) \ge Fib(N+1)$ . Then  $Unrank(V, N+1) = 10 \circ Unrank(V - Fib(N+1), N-1) = 10 \circ Unrank(Rank(b_3..b_{N+1}), N-1) = 10b_3..b_{N+1} = b_1b_2..b_{N+1}$  since we must have  $b_2 = 0$  in this case.

So by induction on N , this is true for all lengths of input.

Modelling frisbee problem as graph For review problem 1 above, explain how we could model the situation with a directed graph (possibly with parallel edges) and interpret the formula in the problem in terms of degrees of vertices in this graph. (10 points)

Consider a graph whose vertices are the players, and where each throw from i to j is a possibly parallel edge from i to j. Then in this graph  $Throw_i$  is the out-degree of vertex i and  $Catch_i$  is the in-degree of vertex i, and the previous equation is that the sum of the in-degrees equals the sum of the out-degrees. We know both are equal to the number of edges, so this is always true.

Modeling word puzzle as graph In a word morphing puzzle, you are given a list of words and want to find a way to move from the first word to the second word using only words that appear in the list and only changing one letter each step. Consider the following example:

WORD, LIST, CORD, CORE, WOOD, FOOD, WORE, FOOL, WOOL, FOOT, LOST

. Describe or draw a graph that would help you solve this puzzle for this example, and say what a solution would mean in terms of the graph. (10 points)

We put a vertex for each word, and connect vertices if the words differ in exactly one letter. Any solution would represent a path from WORD to LIST in this graph, and vice versa. This would be an undirected graph, because words differing in one letter is a symmetric relation.

For this example, the adjacency list for the graph looks like:

 $\bullet$  WORD: CORD, WOOD, WORE

 $\bullet$  LIST: LOST

ullet CORD:WORD,CORE

 $\bullet$  CORE: CORD, WORE

ullet WOOD:WORD,FOOD,WOOL

• FOOD: WO0D, FOOL, FOOT

 $\bullet$  WORE: CORE, WORD

 $\bullet \ FOOL: WO0L, FOOT, FOOD \\$ 

 $\bullet$  WOOL: FO0L, WOOD

 $\bullet$  FOOT: FOOL, FOOD, LOOT

 $\bullet$  LOOT: FOOT

 $\bullet$  LOST: LIST, LOOT

One path is : WORD, WOOD, WOOL, FOOL, FOOT, LOOT, LOST, LIST