- 1. For each k = 2, 3, ..., we define a graph G_k as follows. Let n = k!. Start with a subset U containing n vertices labeled $u_1, u_2, ..., u_n$. We will add to the graph other vertices and edges so that the degree of each vertex in U ends up being k. Now add to the graph, k subsets of vertices $V_1, V_2, ..., V_k$, where $|V_j| = n/j$ for each $j, 1 \le j \le n$. Now we will describe the edges incident on each vertex in V_j . Consider the n/j vertices in V_j in some order. Connect the first vertex in V_j to vertices $u_1, u_2, ..., u_j$, then the second vertex in V_j to $u_{j+1}, u_{j+2}, ..., u_{2j}$, then the third vertex in V_j to $u_{2j+1}, u_{2j+2}, ..., u_{3j}$, and so on. Thus every vertex in V_j has degree j and every vertex in U is connected to exactly one vertex in V_j , for any j.
 - (a) Carefully draw and label the graph G_3 .
 - (b) Now consider the Minimum Vertex Cover (MVC) problem and a simple greedy algorithm for the problem. You've encountered MVC in Reading Response 5. The greedy algorithm I want you to consider, which I will call GREEDYDEGREEBASED is this: repeatedly pick a vertex that covers the most, as yet uncovered edges. This algorithm continues until all edges are covered. Execute this algorithm on G_3 with the following tie-breaking rule: whenever there is a tie between two or more vertices, your algorithm should choose a vertex from $\bigcup_{j=1}^{k} V_j$, rather than a vertex from U. It does not matter how ties are broken between pairs of vertices in $\bigcup_{j=1}^{k} V_j$ or between pairs of vertices in U. What is the vertex cover produced by the algorithm in G_3 ? What is an optimal vertex cover for G_3 ?
 - (c) Your friend claims that the GREEDYDEGREEBASED algorithm is a 3-approximation algorithm. What is the smallest member of the family of graphs G_k defined above that you could use as a counterexample to disprove your friend's claim? Justify your answer in 1-2 sentences.

Note: Here it may help you to know that $\sum_{i=1}^{10} 1/i$ is approximately 2.93 and $\sum_{i=1}^{11} 1/i$ is approximately 3.02.

- 2. Consider the "Shortest Interval first" greedy algorithm for the *Interval Scheduling* problem. (The problem discussed in Section 4.2 "Scheduling Classes" is usually called the Interval Scheduling problem.) In this algorithm, we repeatedly pick a shortest interval to include in our solution and as usual when an interval *I* is picked, then *I* and any overlapping intervals still present are deleted. The algorithm breaks ties arbitrarily; in other words, if there are multiple shortest intervals present, the algorithms picks one arbitrarily. By solving this problem, you will be showing that the "Shortest Interval first" greedy algorithm is a 2-approximation algorithm.
 - (a) Let A be the set of intervals returned by the algorithm for some input and let O be an optimal solution for this input. Prove that every interval in A overlaps at most two intervals in O.
 - (c) Consider an arbitrary input and let A be the set of intervals returned by the algorithm for this input and let O be an optimal solution for this input. Now for each interval xin O, charge \$1 to an interval y in A that overlaps x. Note that y could be identical to x. Also, note that y has to exist; otherwise the greedy algorithm would have added x to the set A. Thus the number of dollars charged is exactly equal to |O|. Now answer the following questions: (i) what is the maximum number of dollars that an interval in A is

charged? (ii) what does this tell us about the relative sizes of A and O? (Express your answer as an inequality connecting |A| and |O|.), and (iii) what does this tell us about the "shortest interval first" algorithm being an approximation algorithm for Interval Scheduling?

3. The *Bin Packing* problem takes as input an infinite supply of *bins* B_1, B_2, B_3, \ldots , each bin of size 1 unit. We are also given *n* items a_1, a_2, \ldots, a_n and each item a_j has a size s_j that is a real number in the interval [0, 1]. The Bin Packing problem seeks to find the smallest number of bins such that all *n* items can be packed into these bins.

For example, suppose that we are given 4 items a_1, a_2, a_3 and a_4 of sizes 0.5, 0.4, 0.6, and 0.5 respectively. We could pack a_1 and a_2 in bin B_1 because $s_1 + s_2 = 0.9 \le 1$. We could then pack a_3 into bin B_2 , but we could not also add a_4 to bin B_2 , because $s_3 + s_4 = 1.1 > 1$. So a_4 would have to be packed in bin B_3 . This gives us a bin packing of the 4 items into three bins. An alternate way of packing items that would lead to the use of just two bins is to pack a_1 and a_2 and a_3 into bin B_2 . This packing that uses only two bins is an optimal solution to the Bin Packing problem.

The *First Fit* greedy algorithm processes items in the given order a_1, a_2, \ldots, a_n and it considers the bins in the order B_1, B_2, \ldots . For each item a_j being processed, the algorithm packs a_j into the first bin that has space for it. It turns out that this very simple algorithm is a 2-approximation algorithm for Bin Packing. The following problems will help you prove this.

- (a) Suppose that the First Fit algorithm packs the given items into t bins. Prove that at most one of these bins has half or more of its space empty. Use this to deduce that the total size of the n input items is (strictly) more than (t-1)/2.
- (b) Use what you showed in (a) to then show that if an optimal bin packing uses b^* bins, then the First Fit algorithm uses at most $2b^*$ bins.